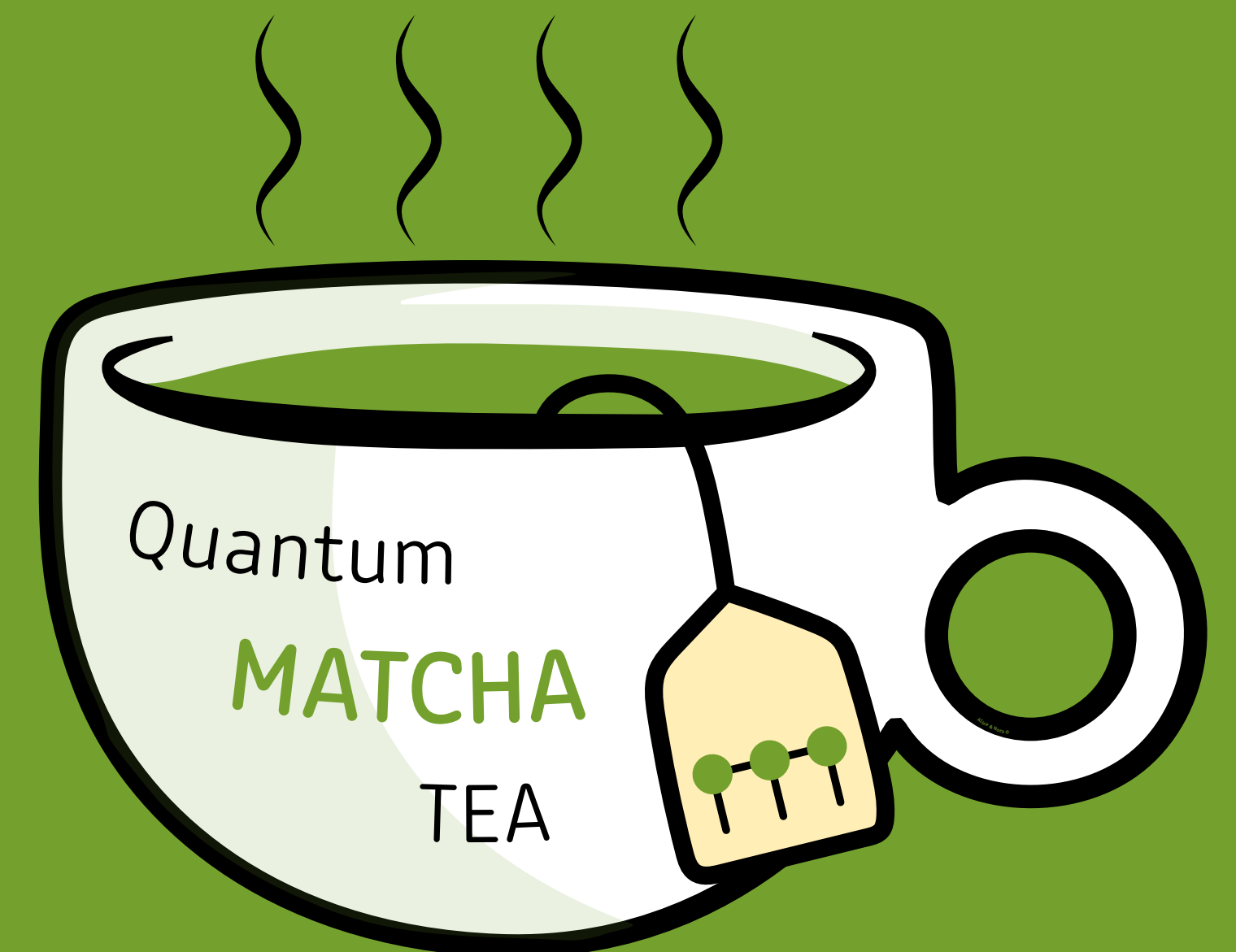


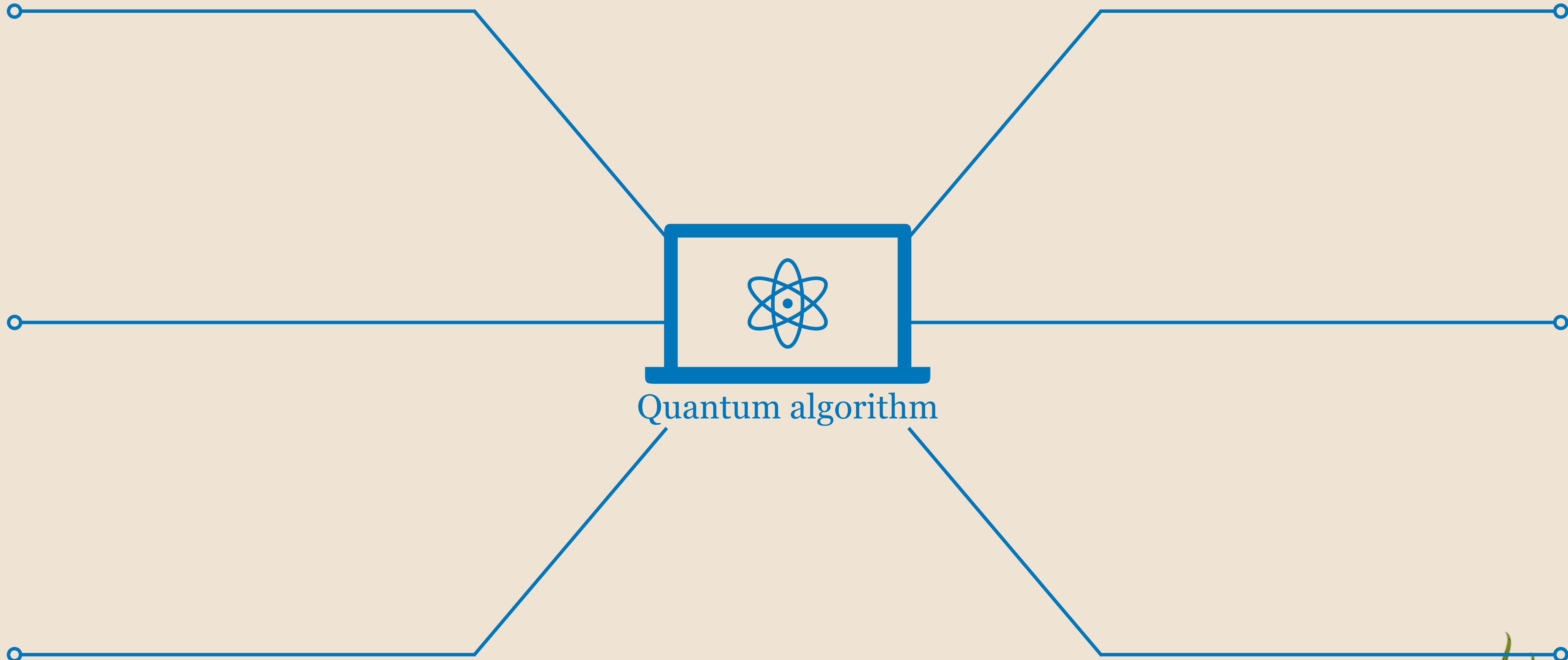
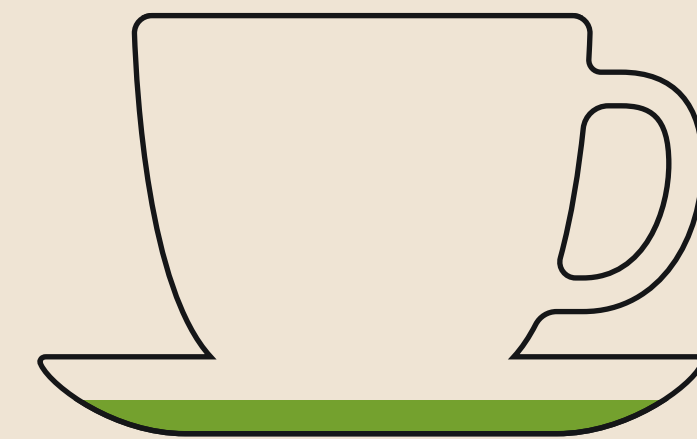
# Quantum Matcha Tea

*An efficient matrix product state simulator for quantum circuits*

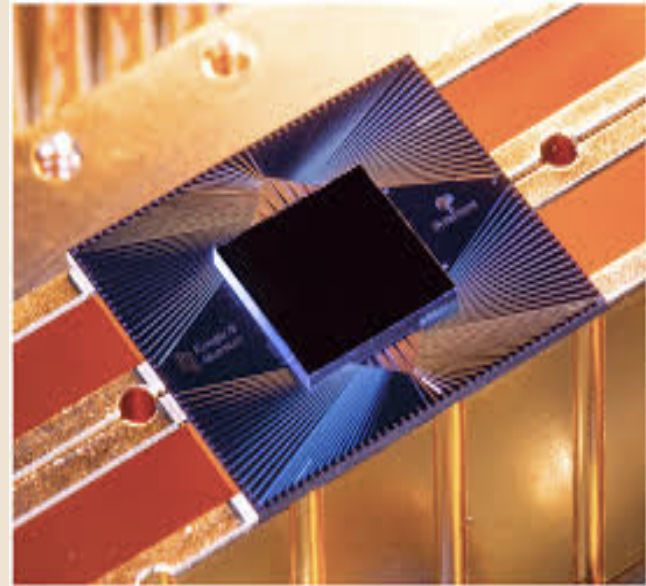
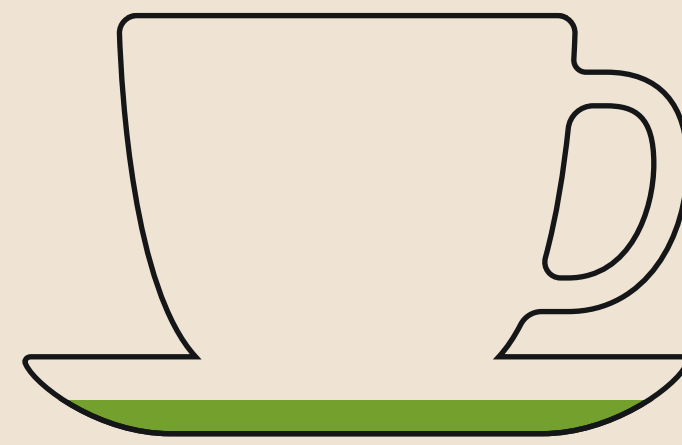
Marco Ballarin  
Università degli studi di Padova



# Running quantum algorithms

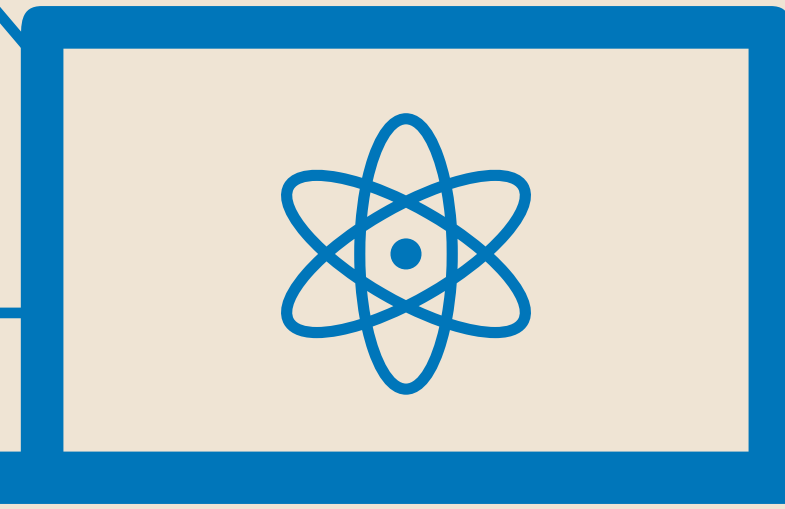


# Running quantum algorithms



- + Real hardware
- Noisy
- Limited number of qubits

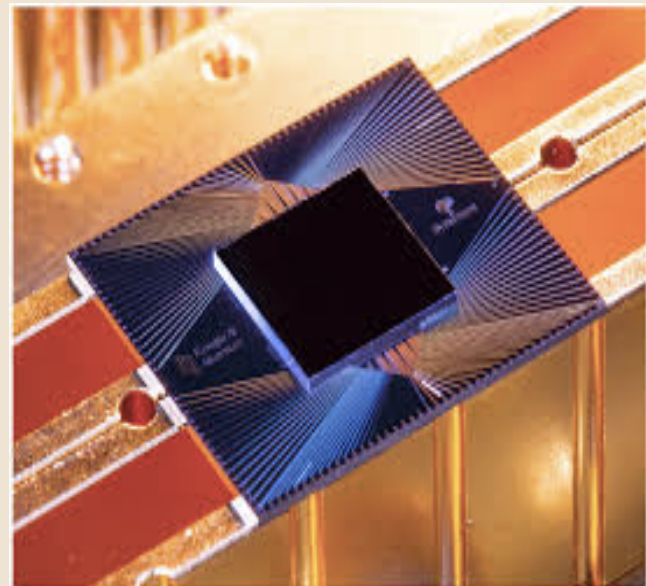
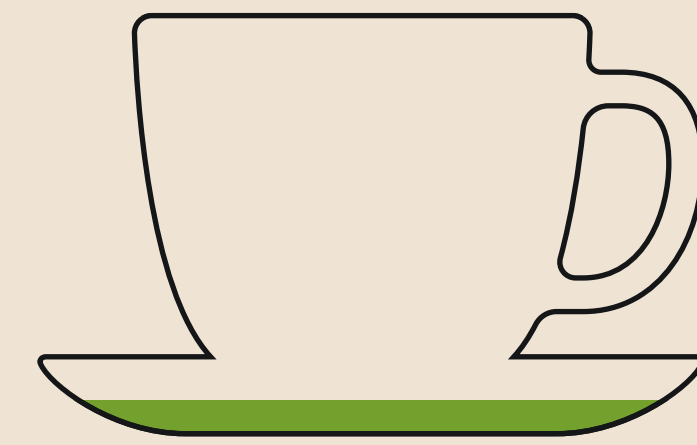
Quantum hardware



Quantum algorithm

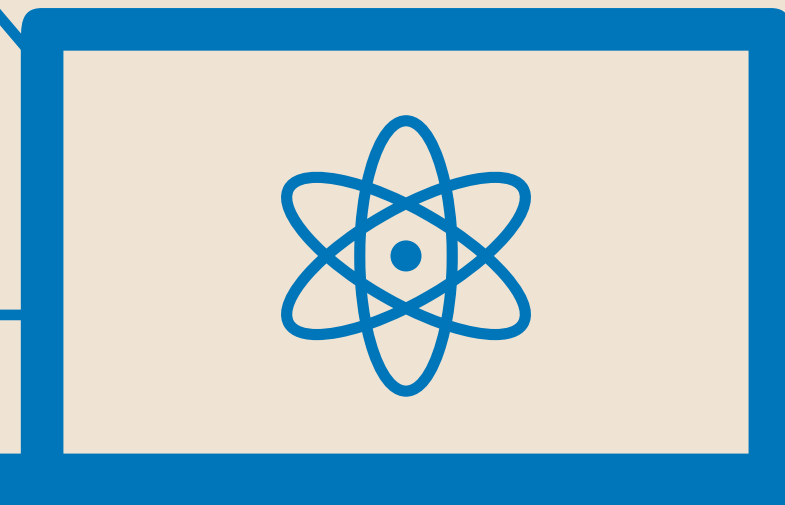


# Running quantum algorithms



- + Real hardware
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Quantum hardware



Quantum algorithm

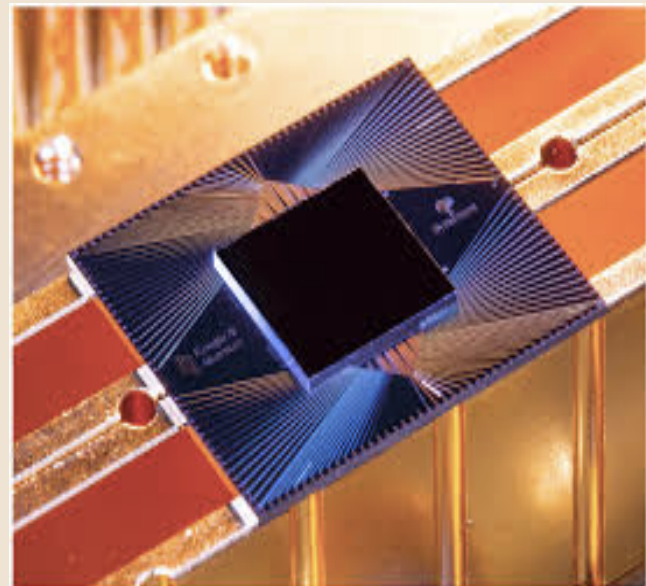
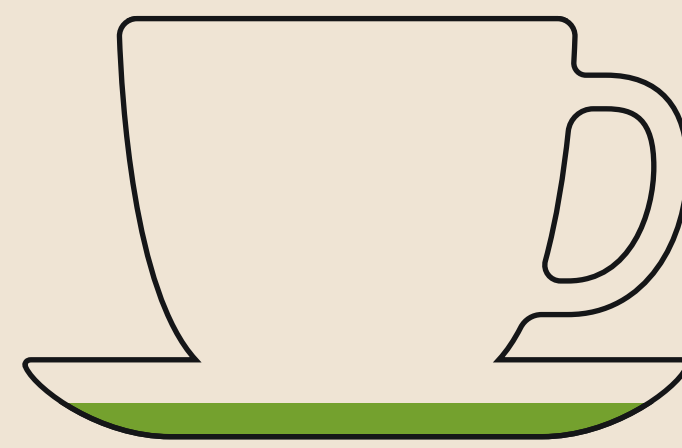
- High # of qubits +
- Flexibility (observables) -
- Depth of the circuit -



cuQuantum

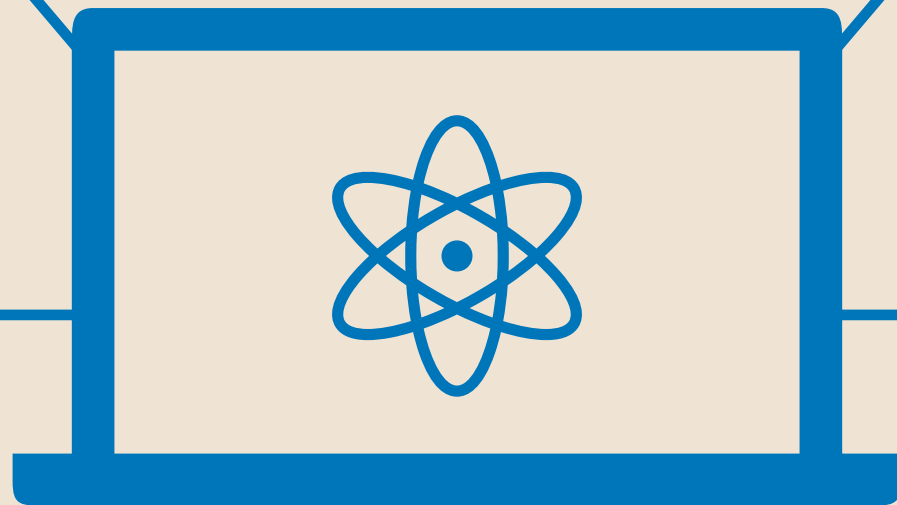


# Running quantum algorithms



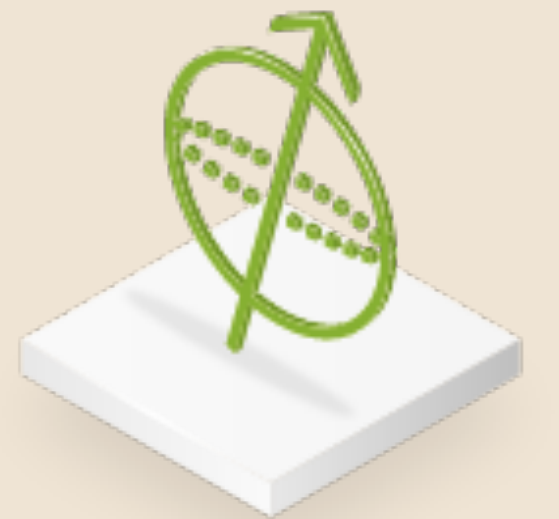
- + Real hardware
- Noisy
- Limited number of qubits

Quantum hardware

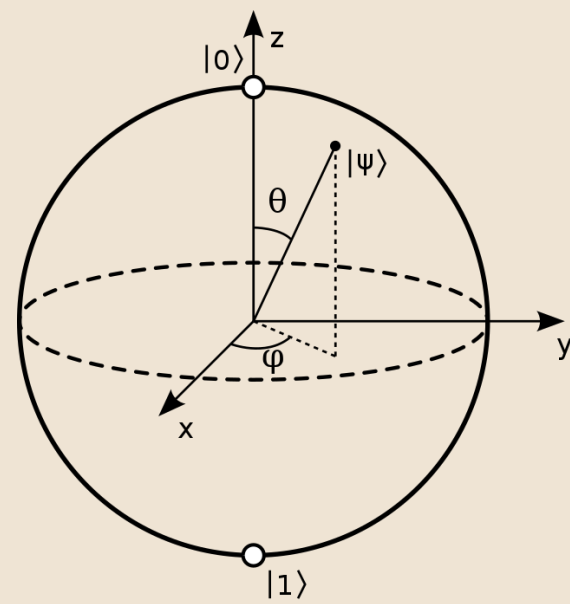


Quantum algorithm

- High # of qubits +
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cuQuantum

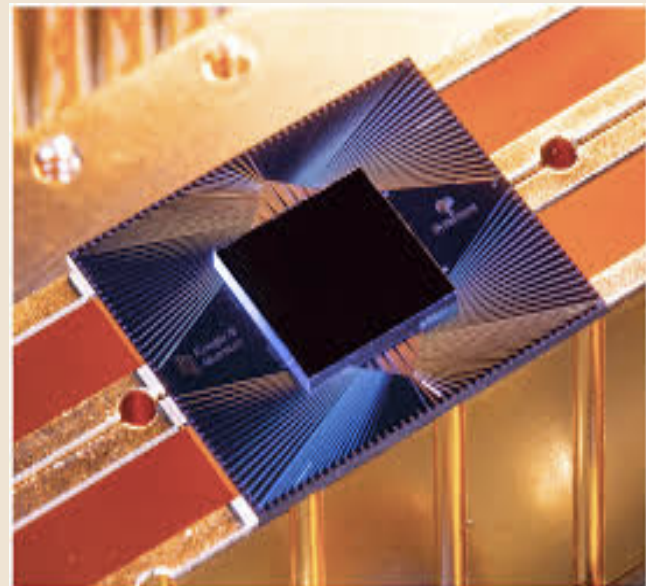
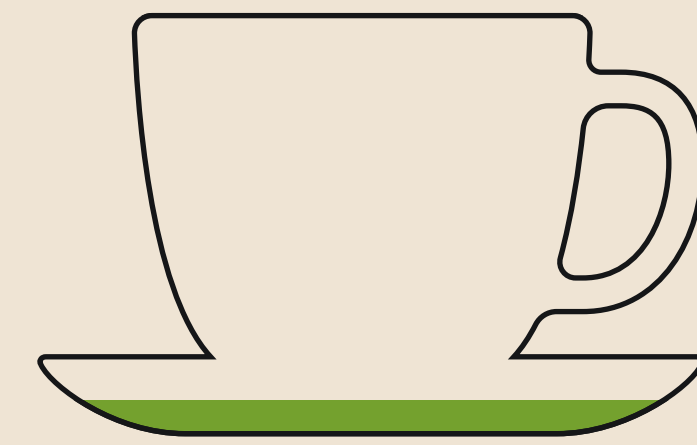


- + Access to exact state
- Limited number of qubits

Exact simulator

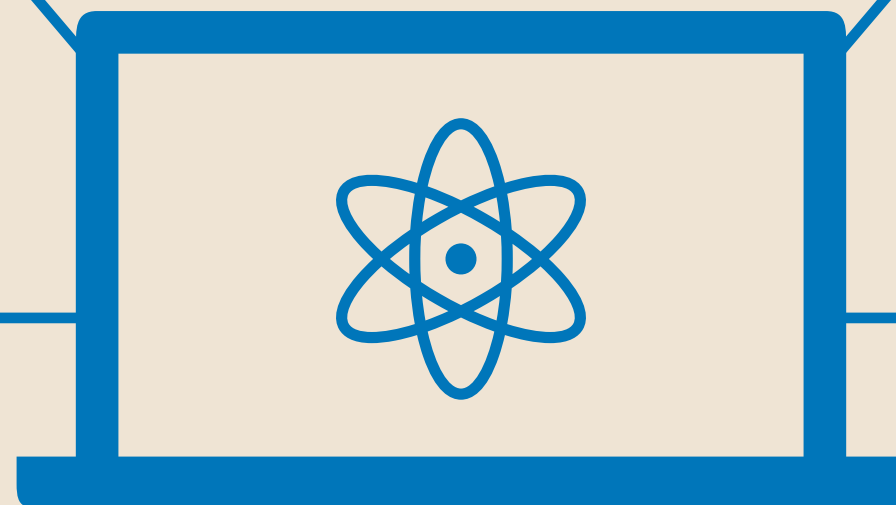


# Running quantum algorithms



- + Real hardware
- Noisy
- Limited number of qubits

Quantum hardware

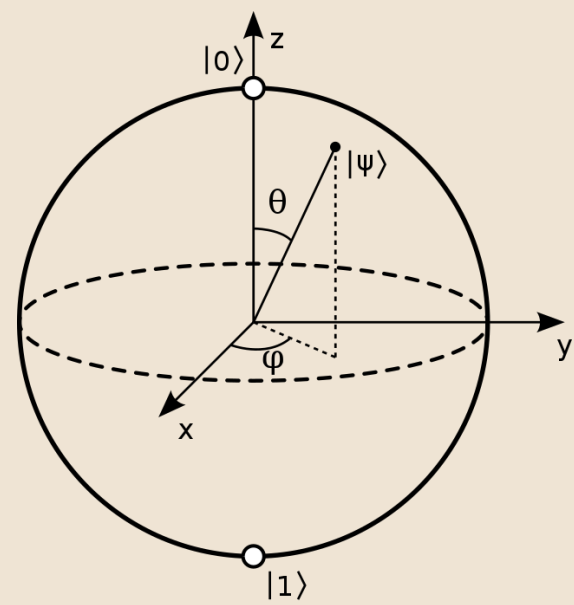


Quantum algorithm

- High # of qubits +
- Flexibility (observables) -
- Depth of the circuit -



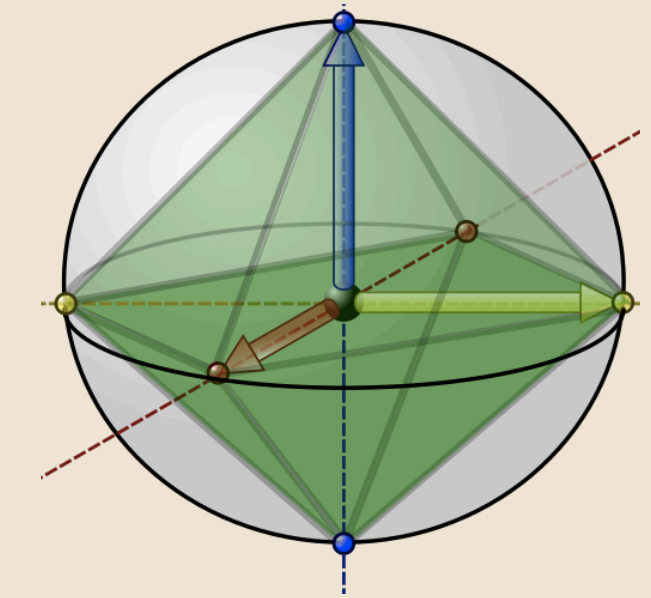
cuQuantum



- + Access to exact state
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Exact simulator

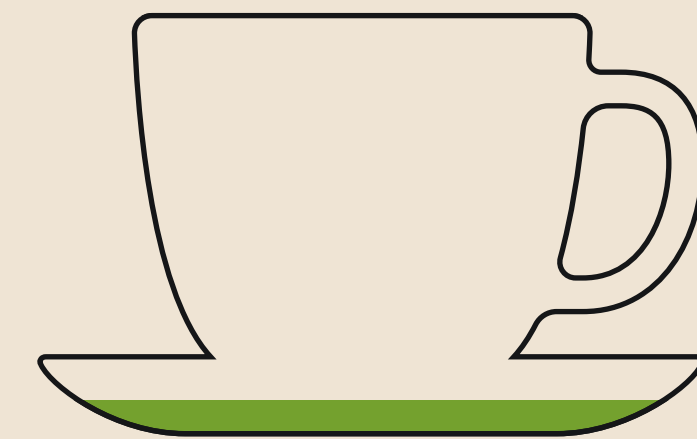
- High # of qubits +
- Flexibility (# of T gates) -



Clifford simulator

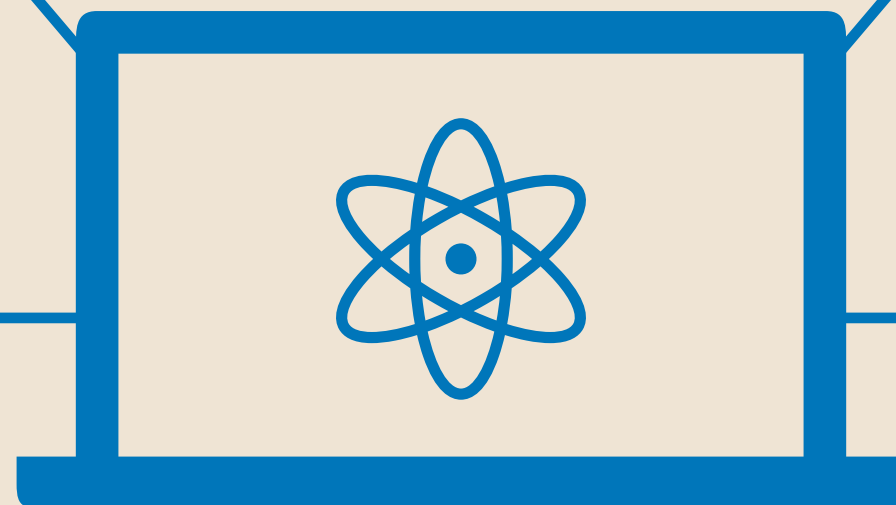


# Running quantum algorithms



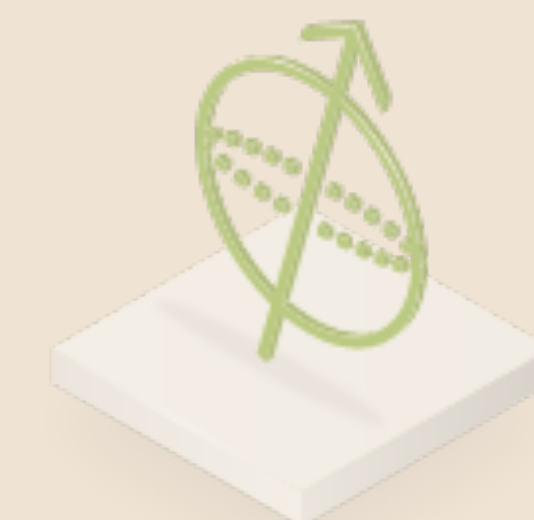
- + Real hardware
- Noisy
- Limited number of qubits

Quantum hardware

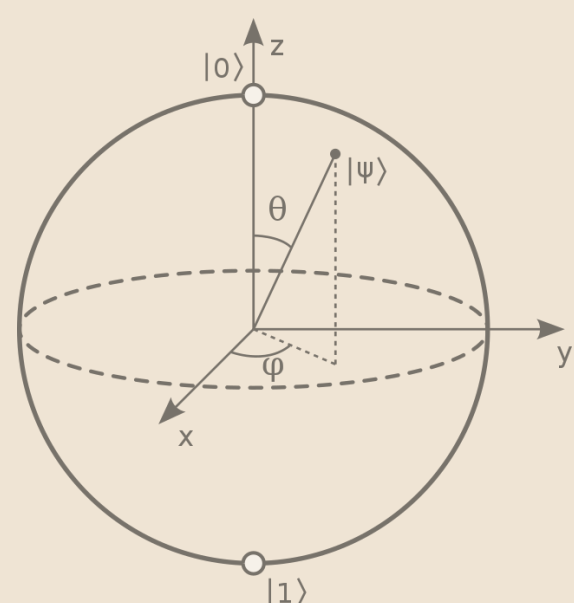


Quantum algorithm

- High # of qubits +
- Flexibility (observables) -
- Depth of the circuit -



cuQuantum



- + Access to exact state
- Limited number of qubits

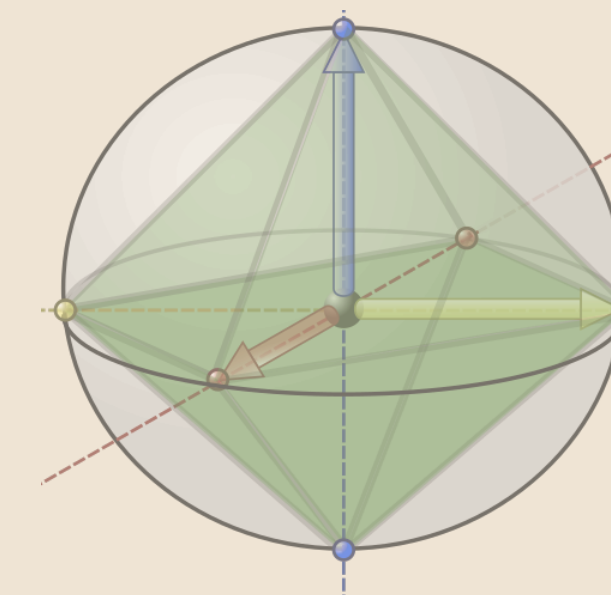
Exact simulator

Tensor Network simulator



- + High # of qubits
- Flexibility (entanglement)

- High # of qubits +
- Flexibility (# of T gates) -



Clifford simulator



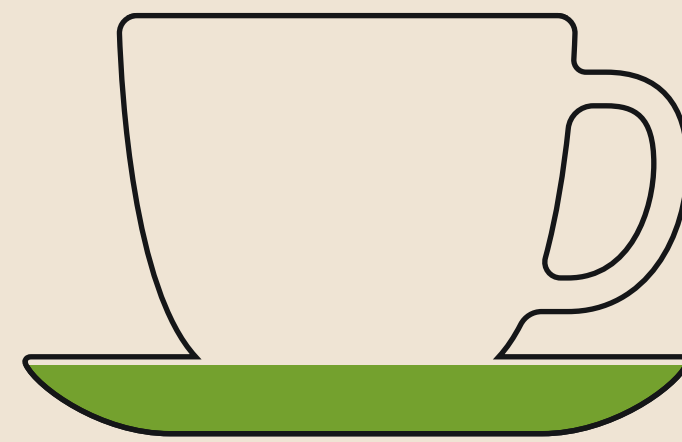
# Why tensor networks

$$\dim(\mathcal{H}) = 2^n$$

We can represent a  
subset efficiently



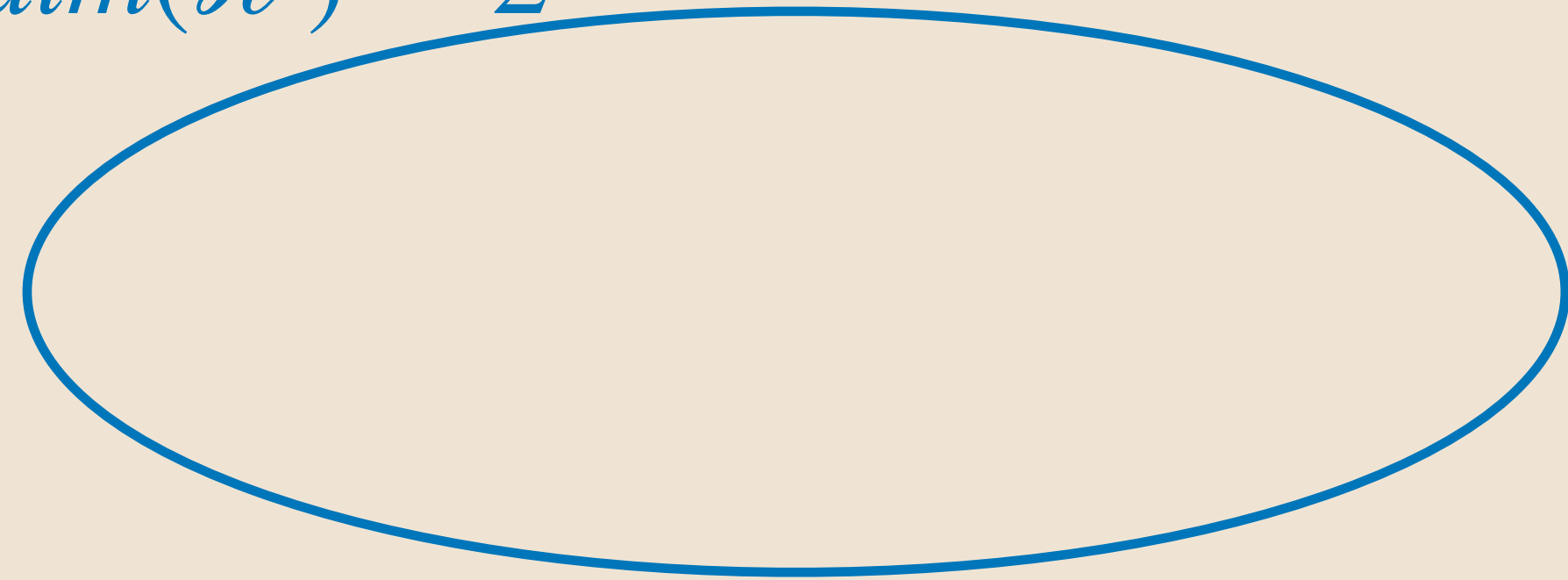
?





# Why tensor networks

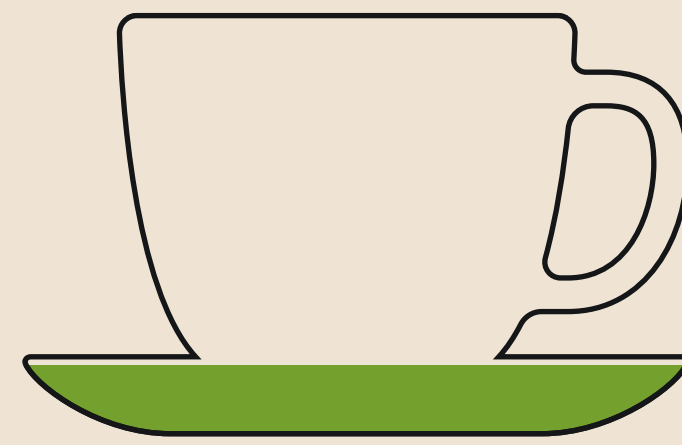
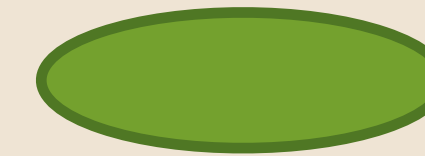
$$\dim(\mathcal{H}) = 2^n$$



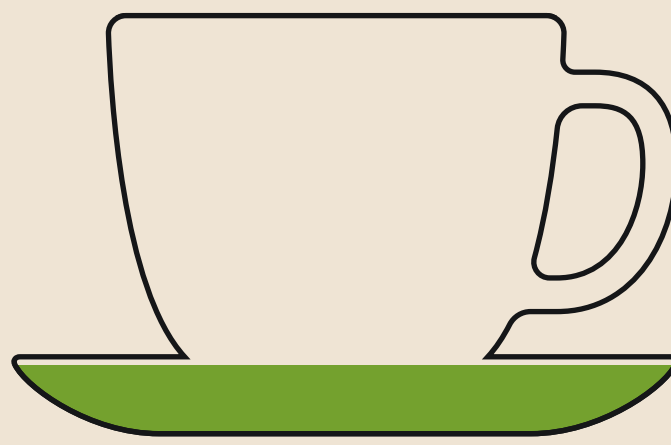
?



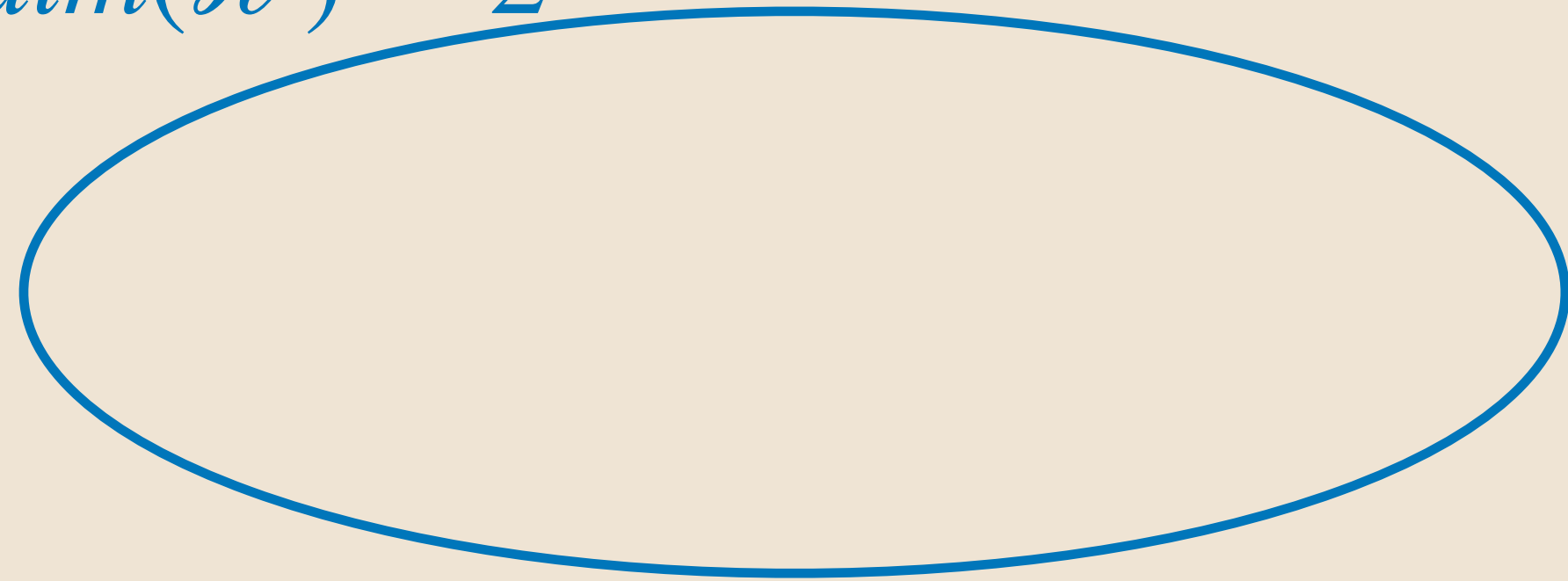
We can represent a subset efficiently



# Why tensor networks



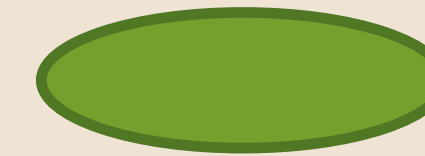
$$\dim(\mathcal{H}) = 2^n$$



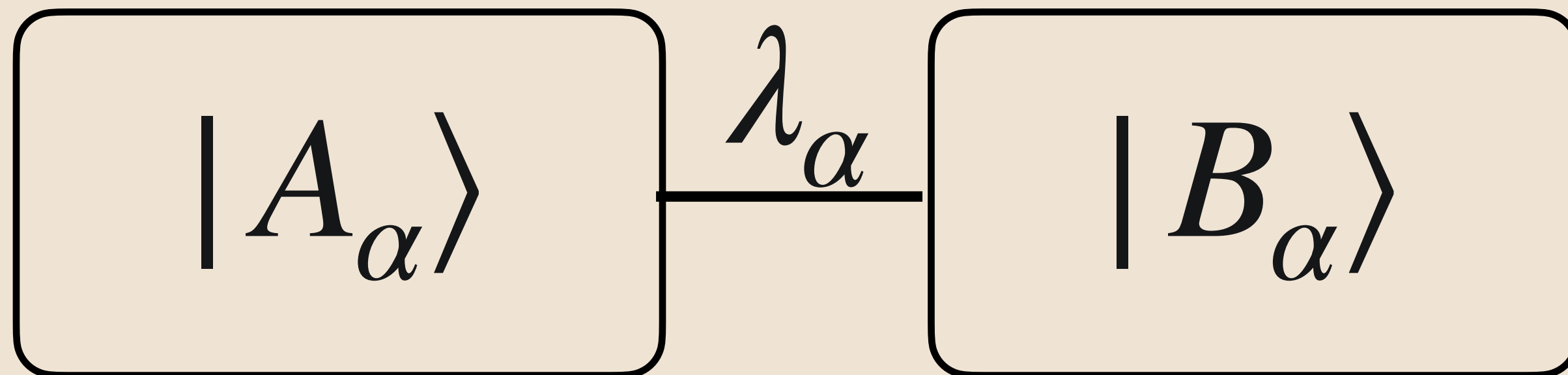
?



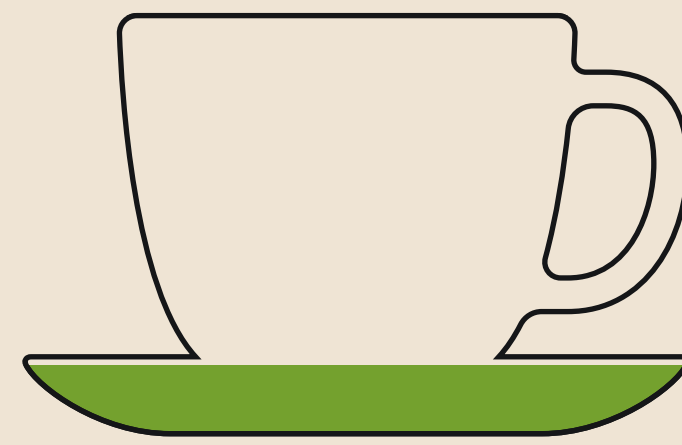
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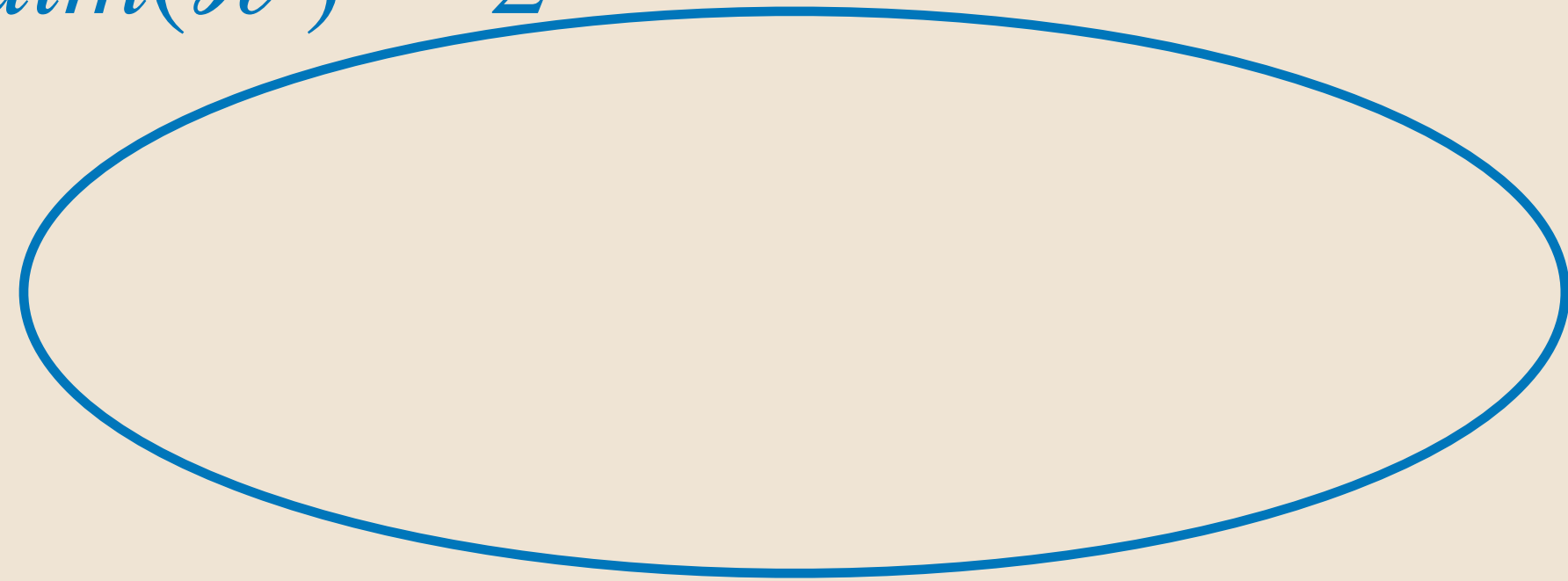
$$|\psi\rangle = \sum_{\alpha=1}^{\chi} \lambda_{\alpha} |A_{\alpha}\rangle |B_{\alpha}\rangle$$



# Why tensor networks



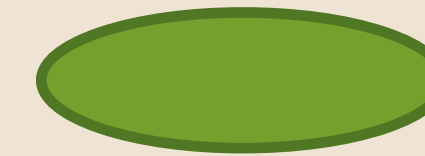
$$\dim(\mathcal{H}) = 2^n$$



?

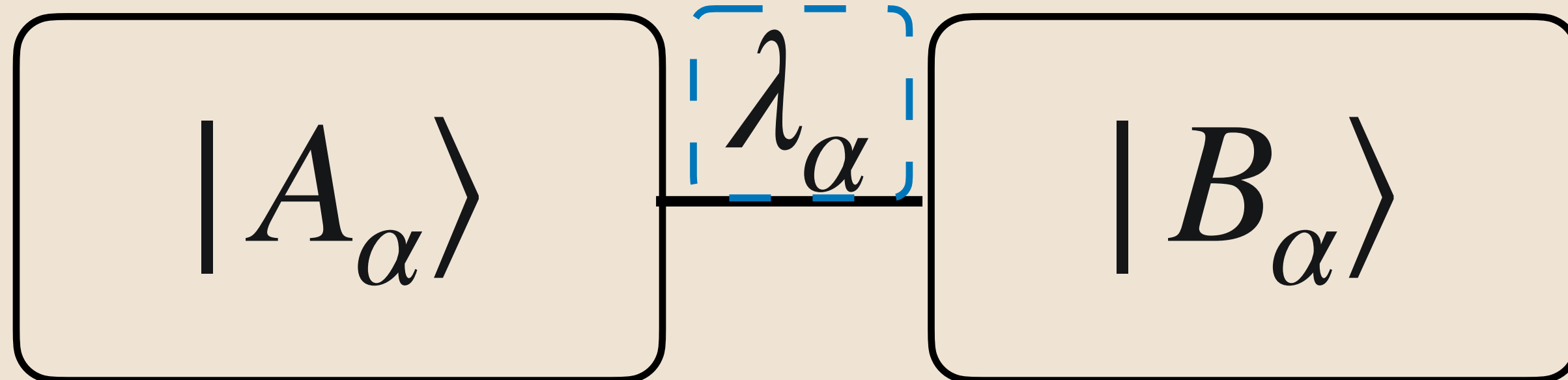


We can represent a subset efficiently

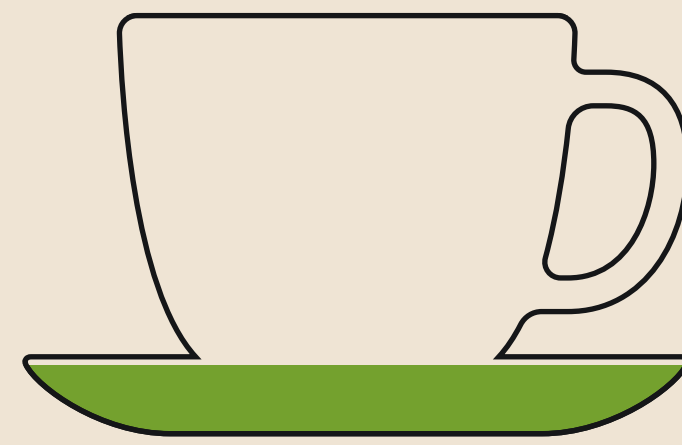


Tensor networks compress the quantum correlations between subsystems  $\Rightarrow$  **compress entanglement**

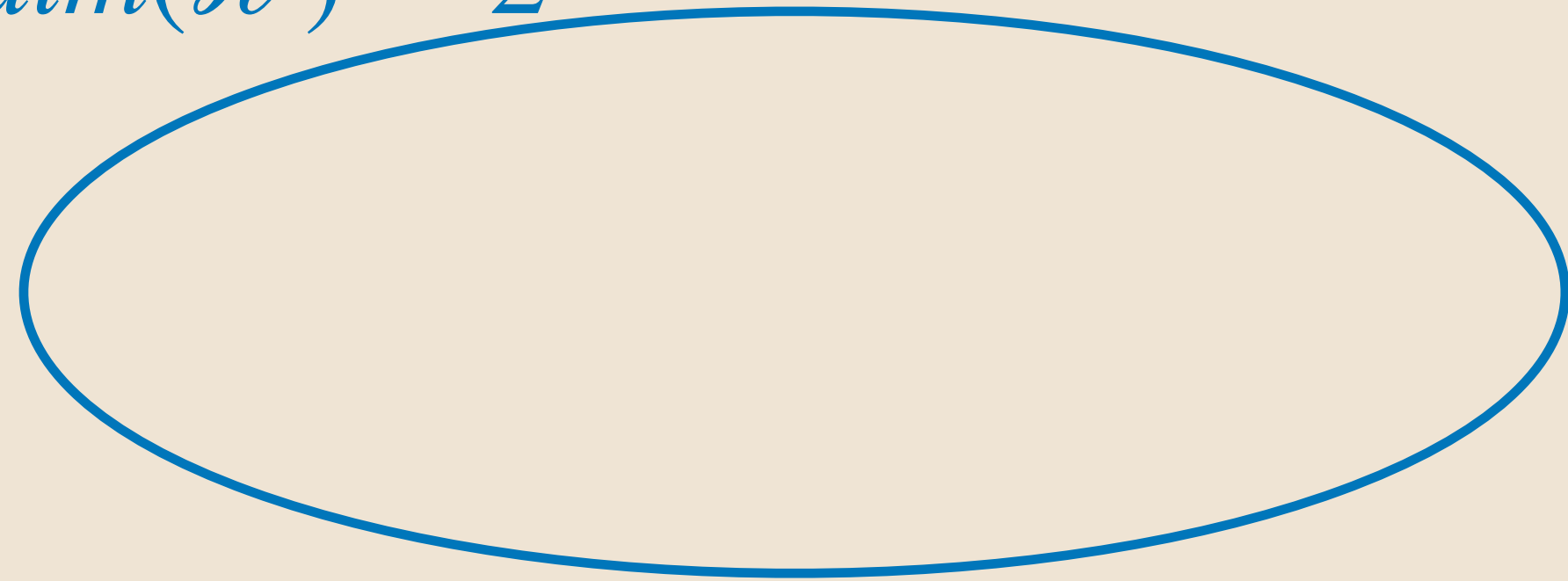
$$|\psi\rangle = \sum_{\alpha=1}^{\chi} |A_{\alpha}\rangle$$



# Why tensor networks



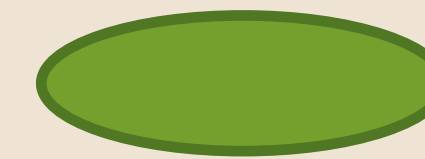
$$\dim(\mathcal{H}) = 2^n$$



?

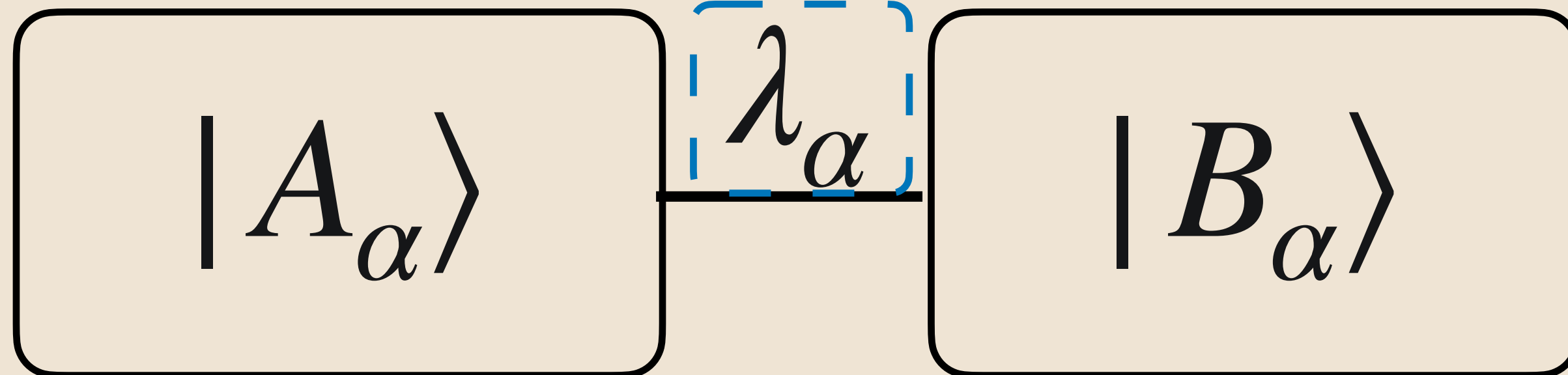


We can represent a subset efficiently



Tensor networks compress the quantum correlations between subsystems  $\Rightarrow$  **compress entanglement**

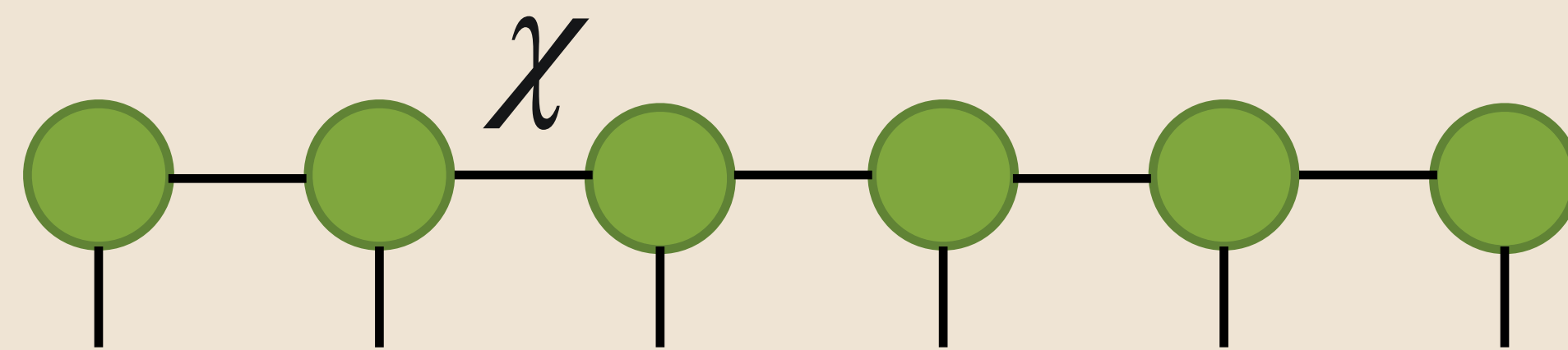
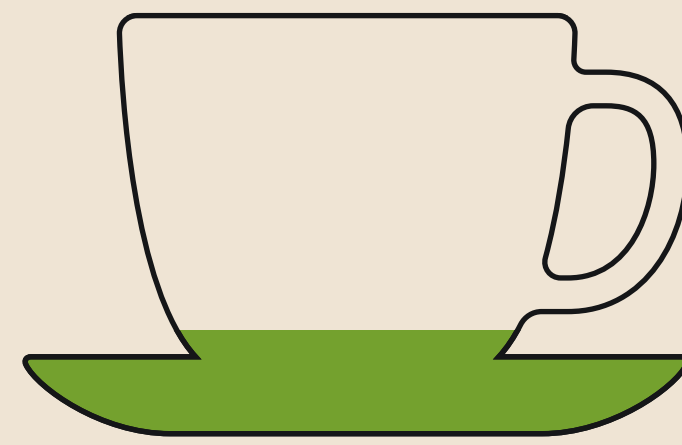
$$|\psi\rangle = \sum_{\alpha=1}^{\chi} |A_{\alpha}\rangle |B_{\alpha}\rangle$$



Only keep highest  $\chi$  Schmidt values



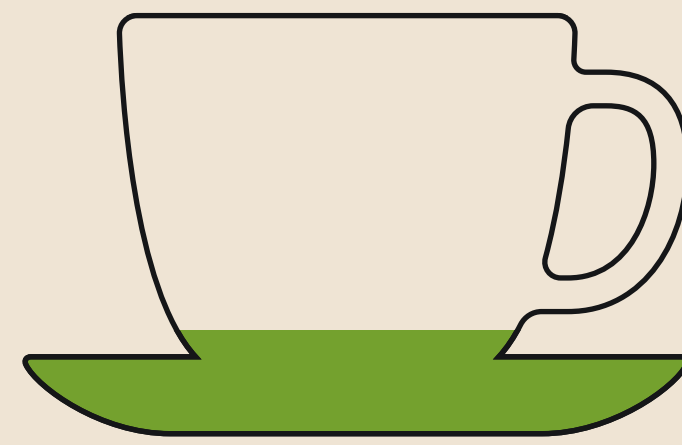
# Matrix product states



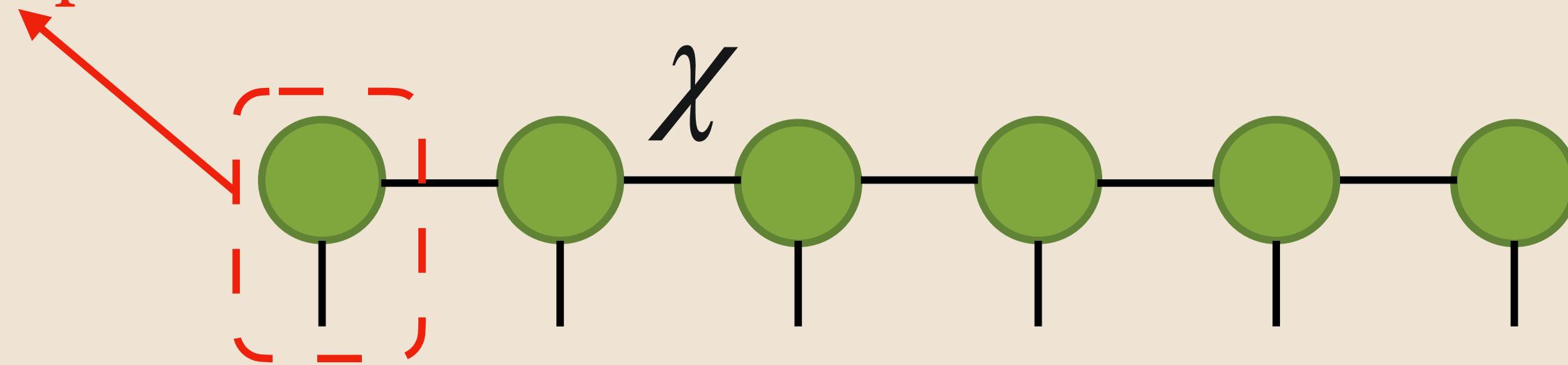
Memory requirements  
 $O(2^n) \rightarrow O(2n\chi^2)$



# Matrix product states



Each tensor (ball) encodes  
the state of a qubit

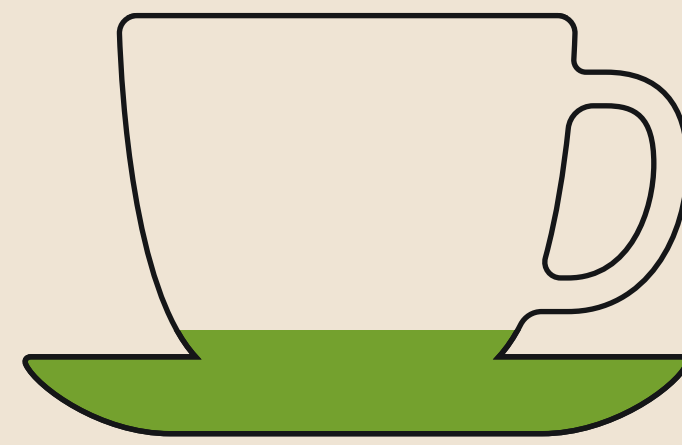


Memory requirements

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# Matrix product states

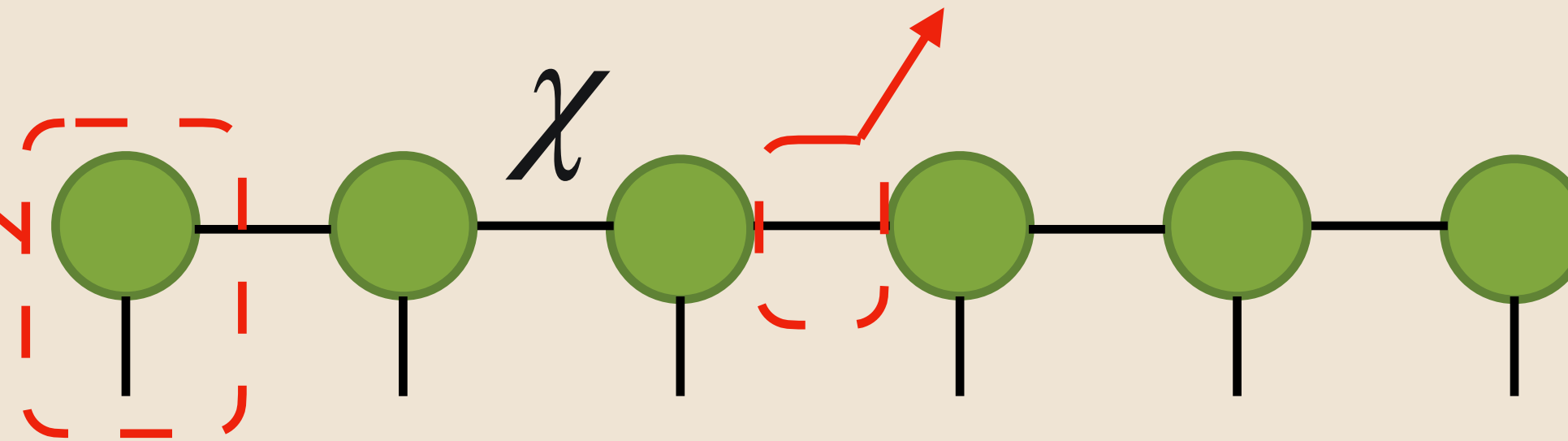


Each tensor (ball) encodes the state of a qubit

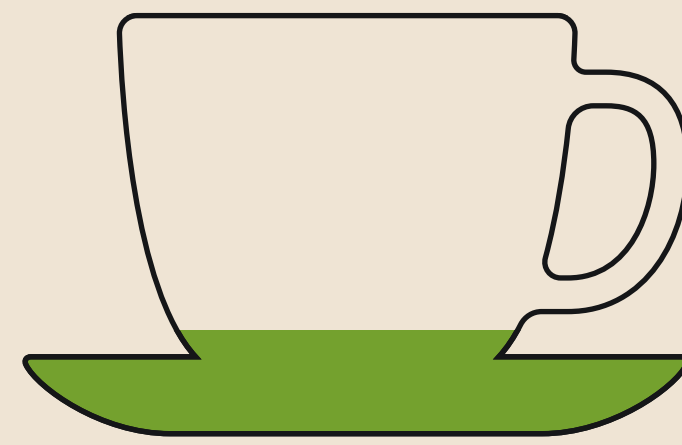
Bonds encode entanglement between qubits

Memory requirements

$$O(2^n) \rightarrow O(2n\chi^2)$$



# Matrix product states



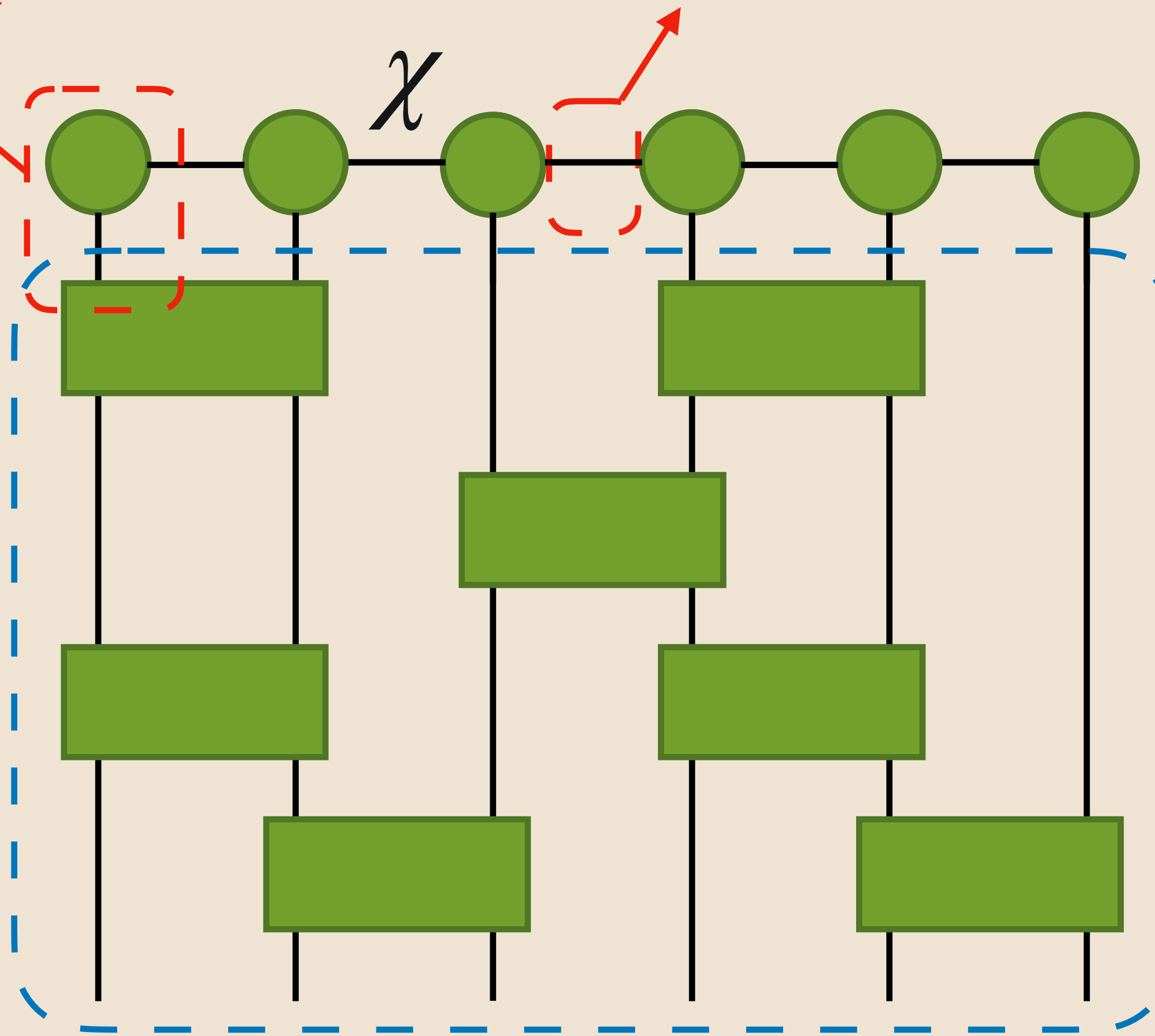
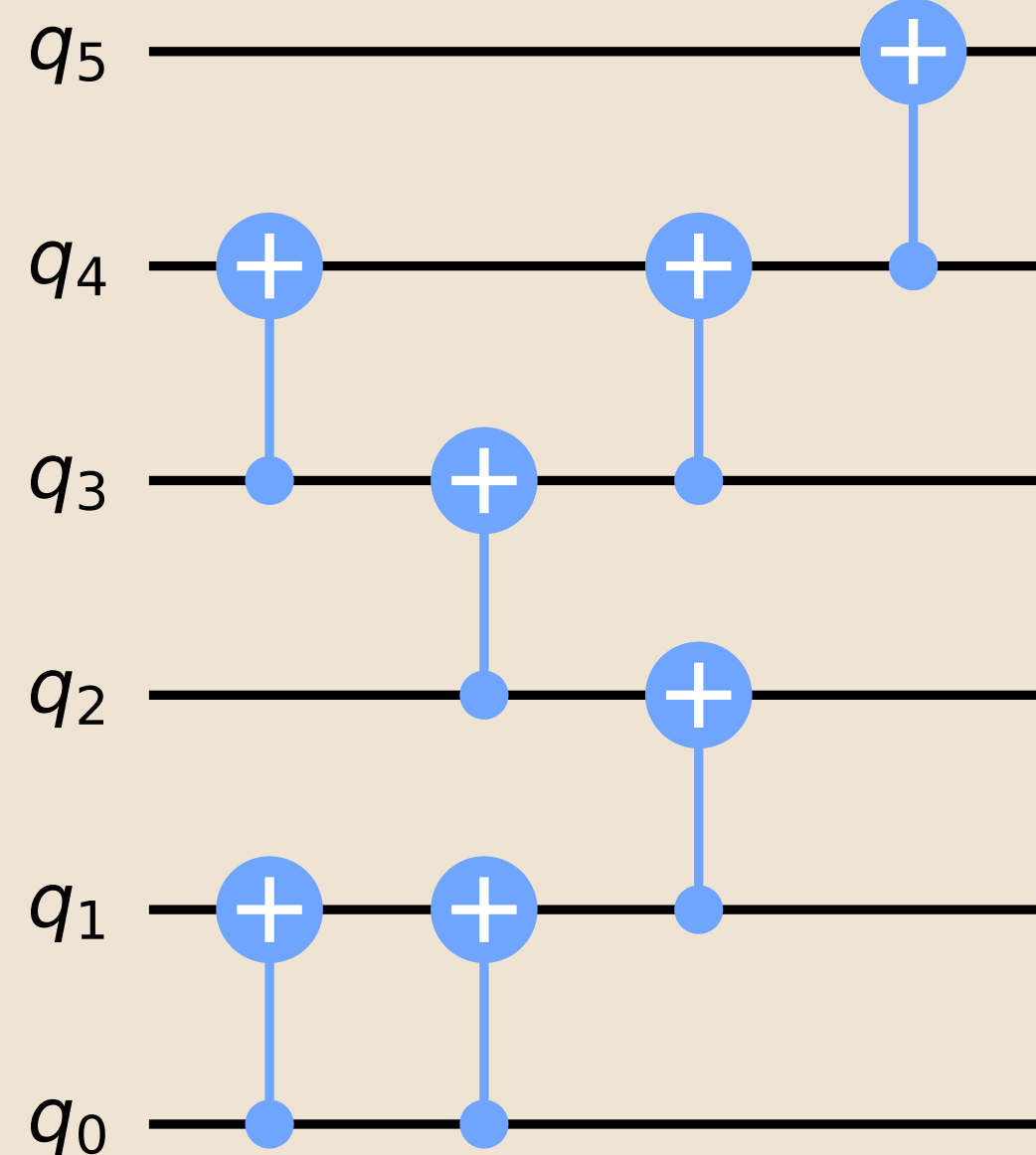
Each tensor (ball) encodes the state of a qubit

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Memory requirements

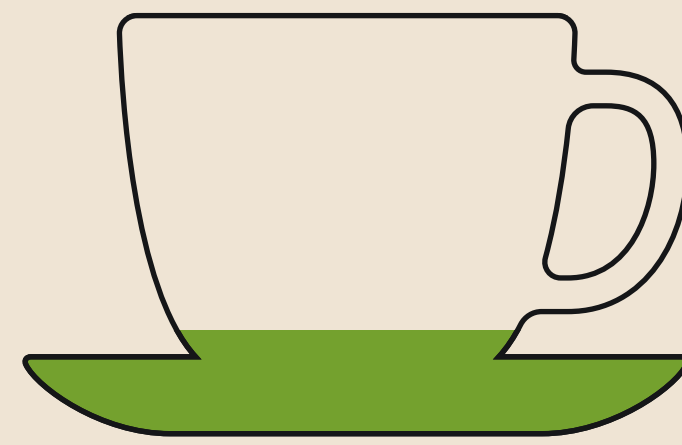
$$O(2^n) \rightarrow O(2n\chi^2)$$

State evolution through quantum circuit





# Matrix product states



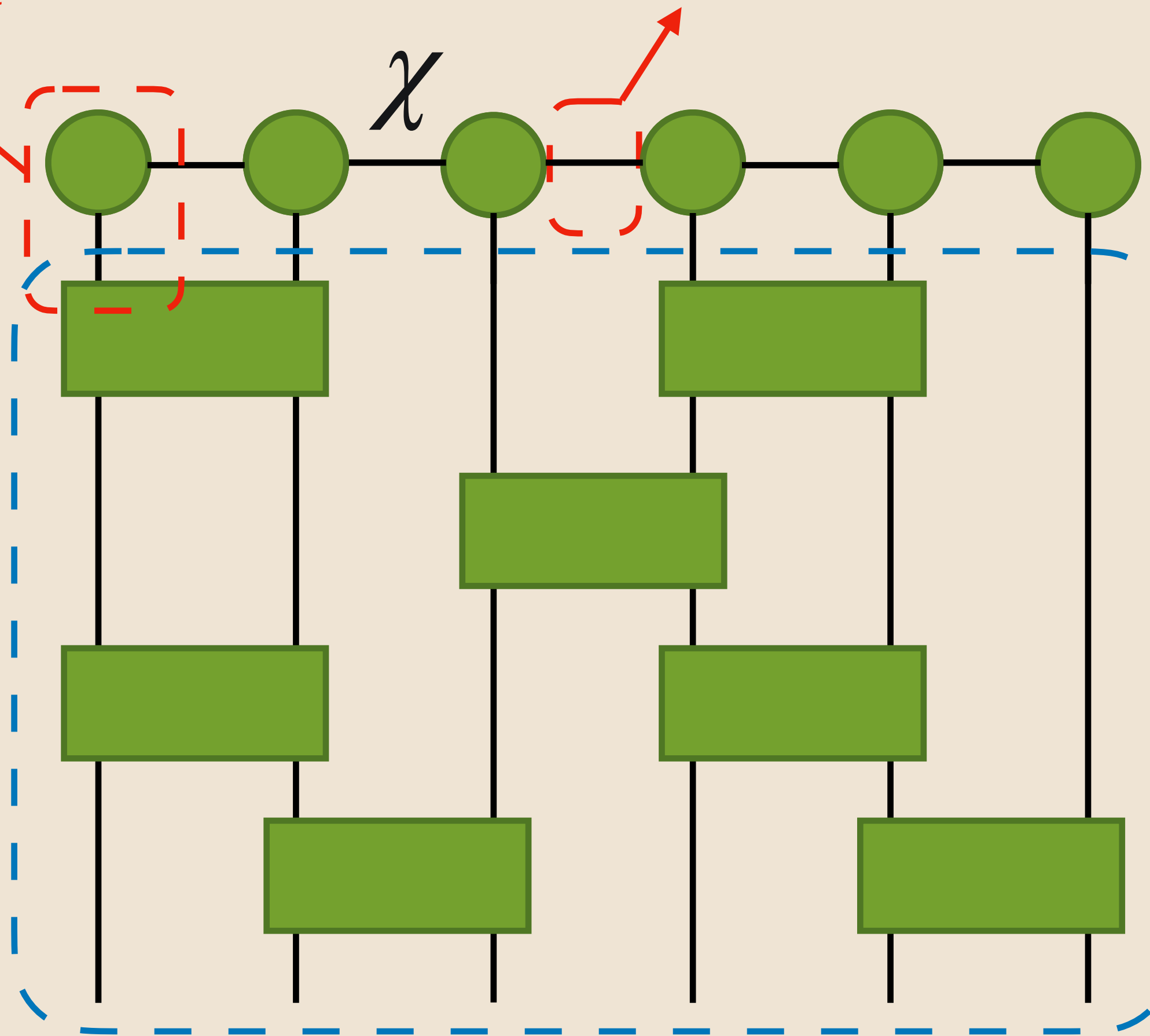
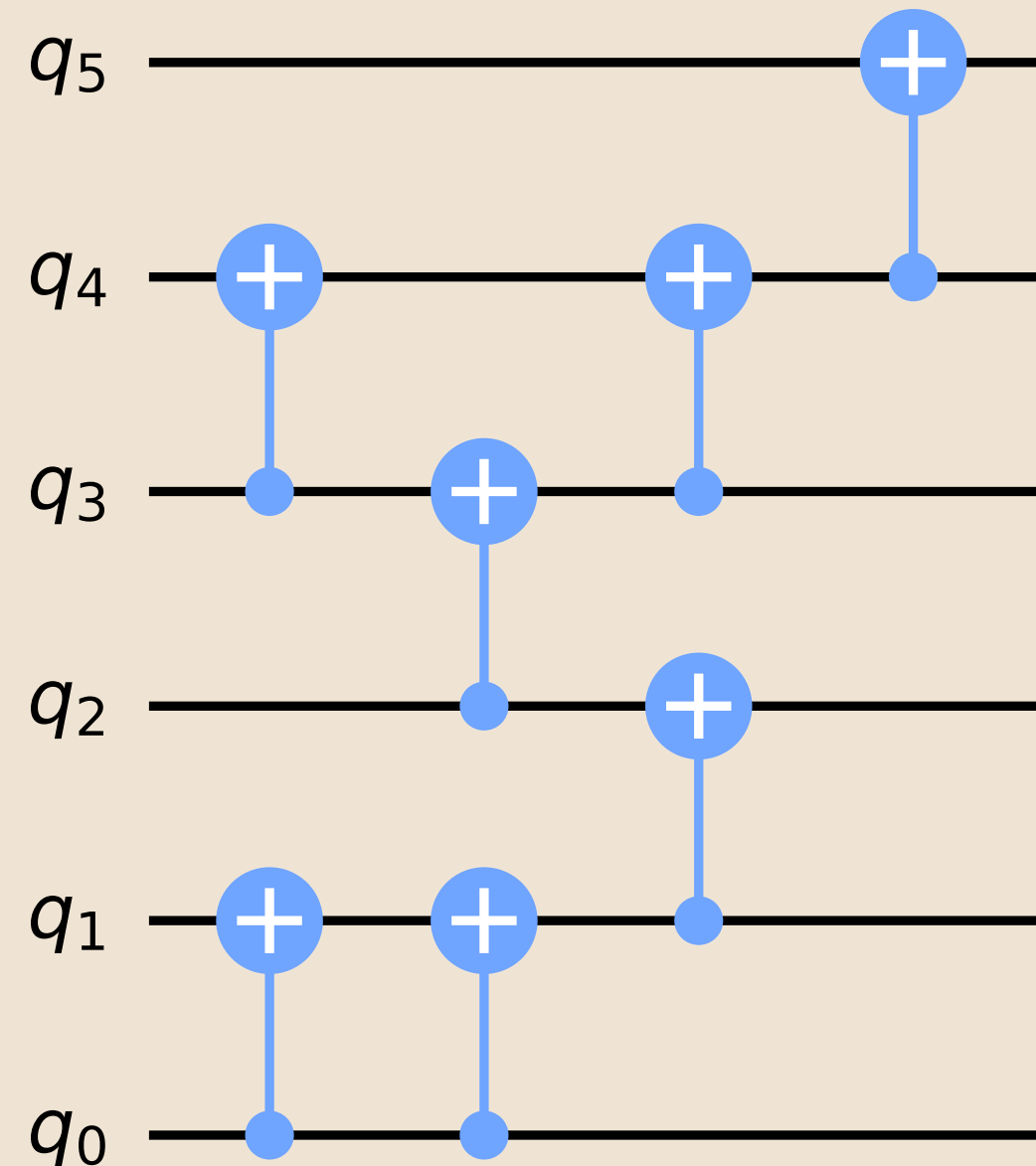
Each tensor (ball) encodes the state of a qubit

Bonds encode entanglement between qubits

Memory requirements

$$O(2^n) \rightarrow O(2n\chi^2)$$

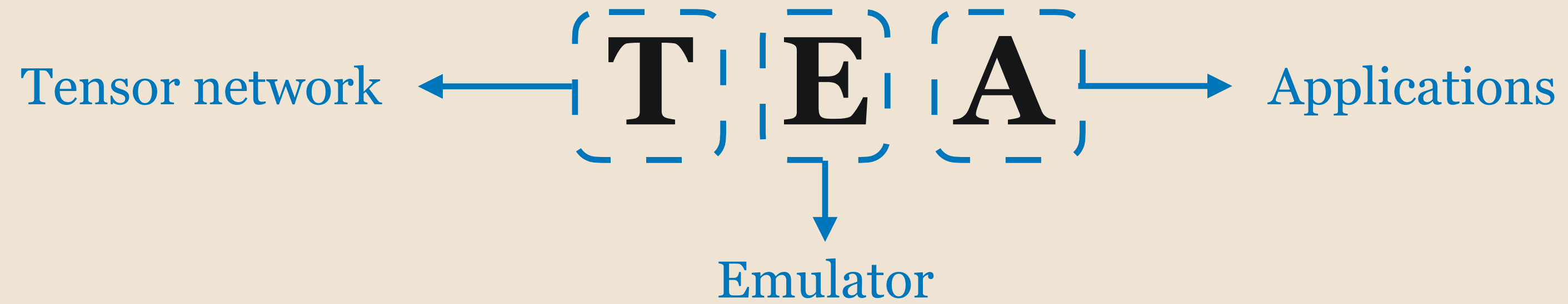
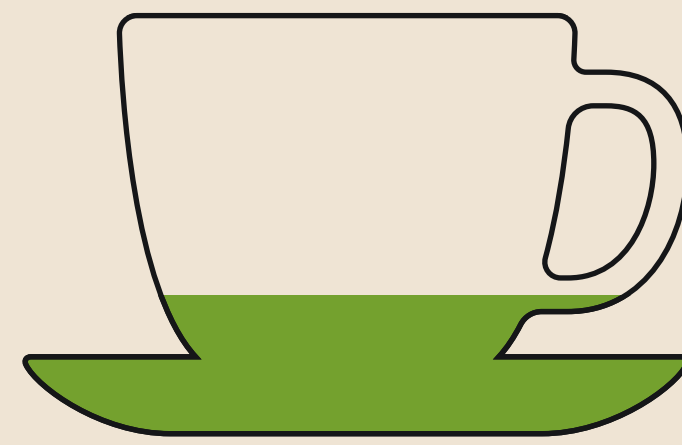
State evolution through quantum circuit



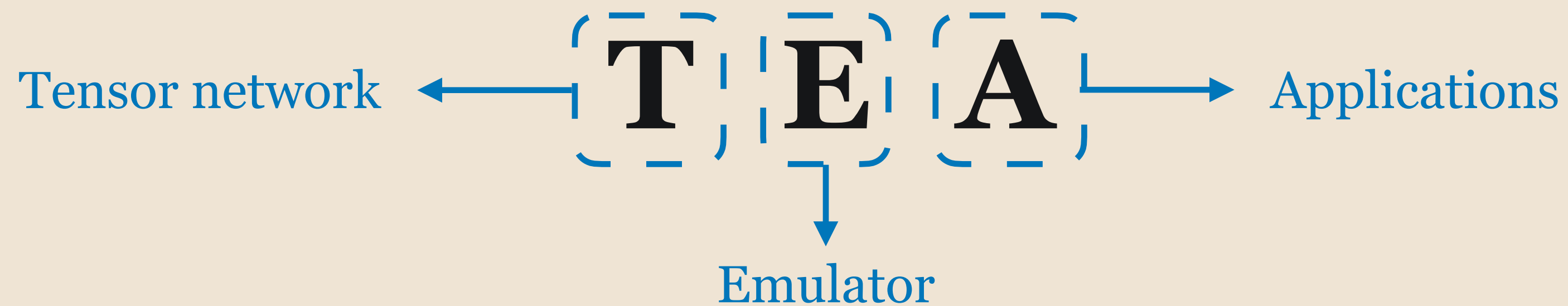
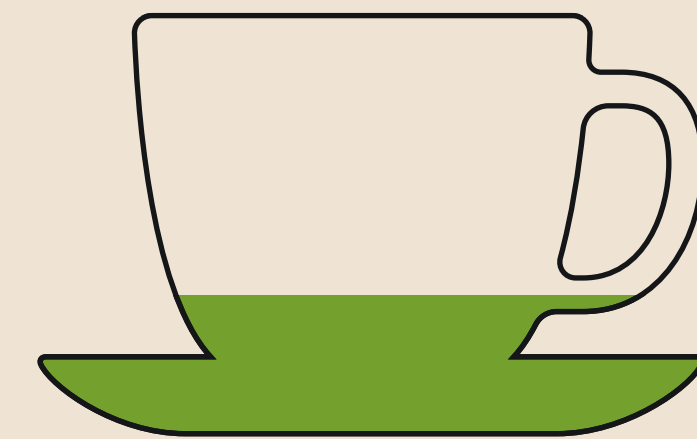
MPS SIMULATIONS ARE NOT LIMITED BY THE NUMBER OF QUBITS BUT BY THE ENTANGLEMENT



# Quantum TEA distribution



# Quantum TEA distribution



Quantum tea leaves: **Utility**



Quantum matcha tea: **quantum circuit HPC simulations**



Quantum red tea: **tensor handling**



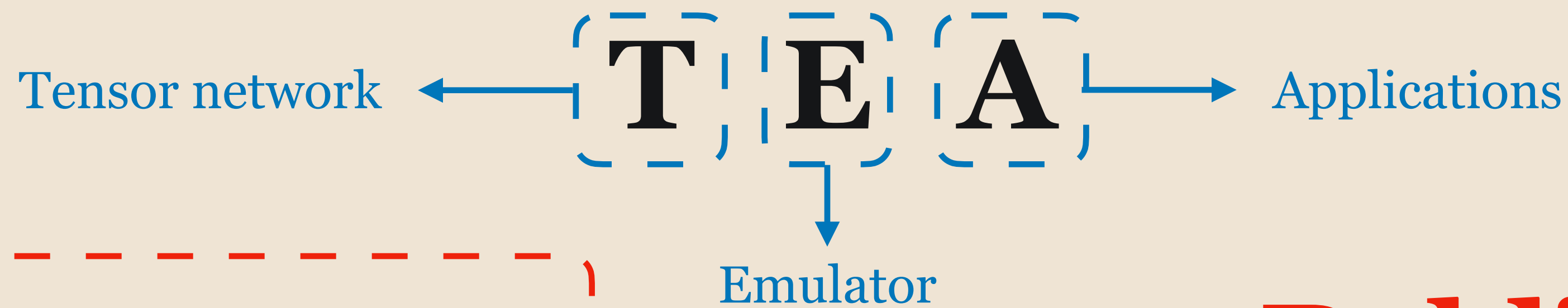
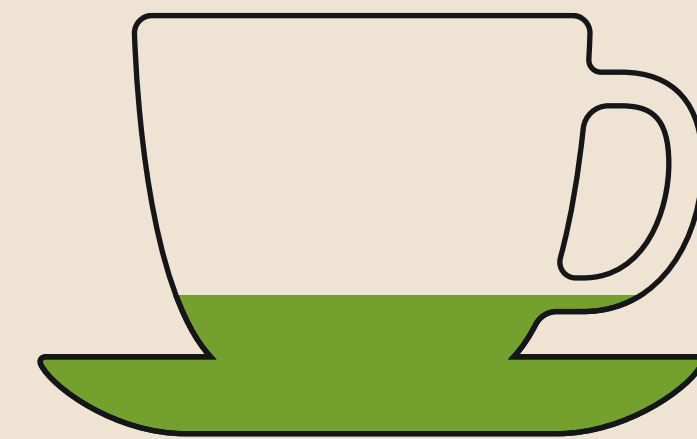
Quantum chai tea: **AI and ML with tensor networks**



Quantum green tea: **Schrödinger equation solution for many-body states**



# Quantum TEA distribution



Quantum tea leaves: **Utility**

**Public!**



Quantum matcha tea: **quantum circuit HPC simulations**



Quantum red tea: **tensor handling**



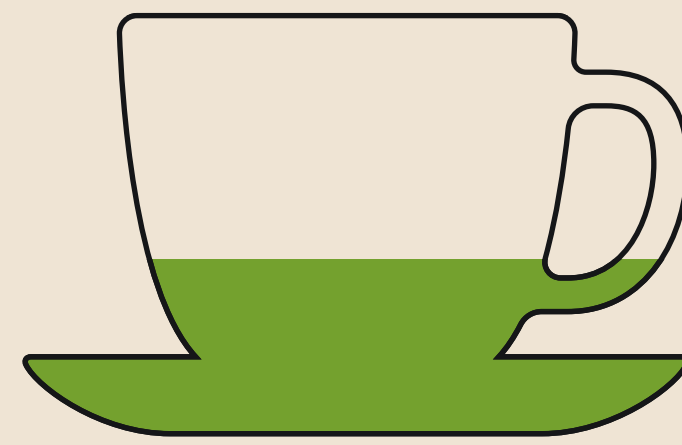
Quantum chai tea: **AI and ML with tensor networks**



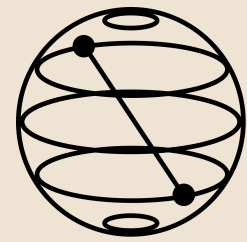
Quantum green tea: **Schrödinger equation solution for many-body states**



# Quantum Matcha Tea workflow



Quantum circuit



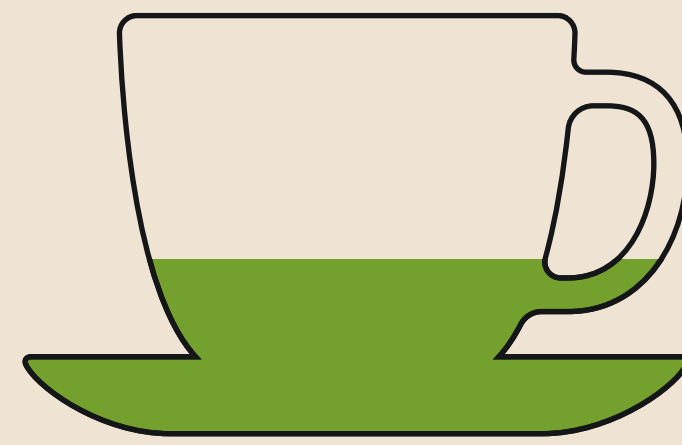
Observables



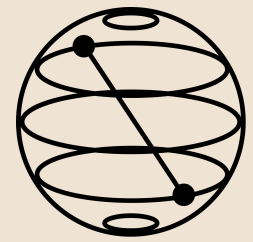
Python interface, definition  
of the problem



# Quantum Matcha Tea workflow



Quantum circuit



Observables



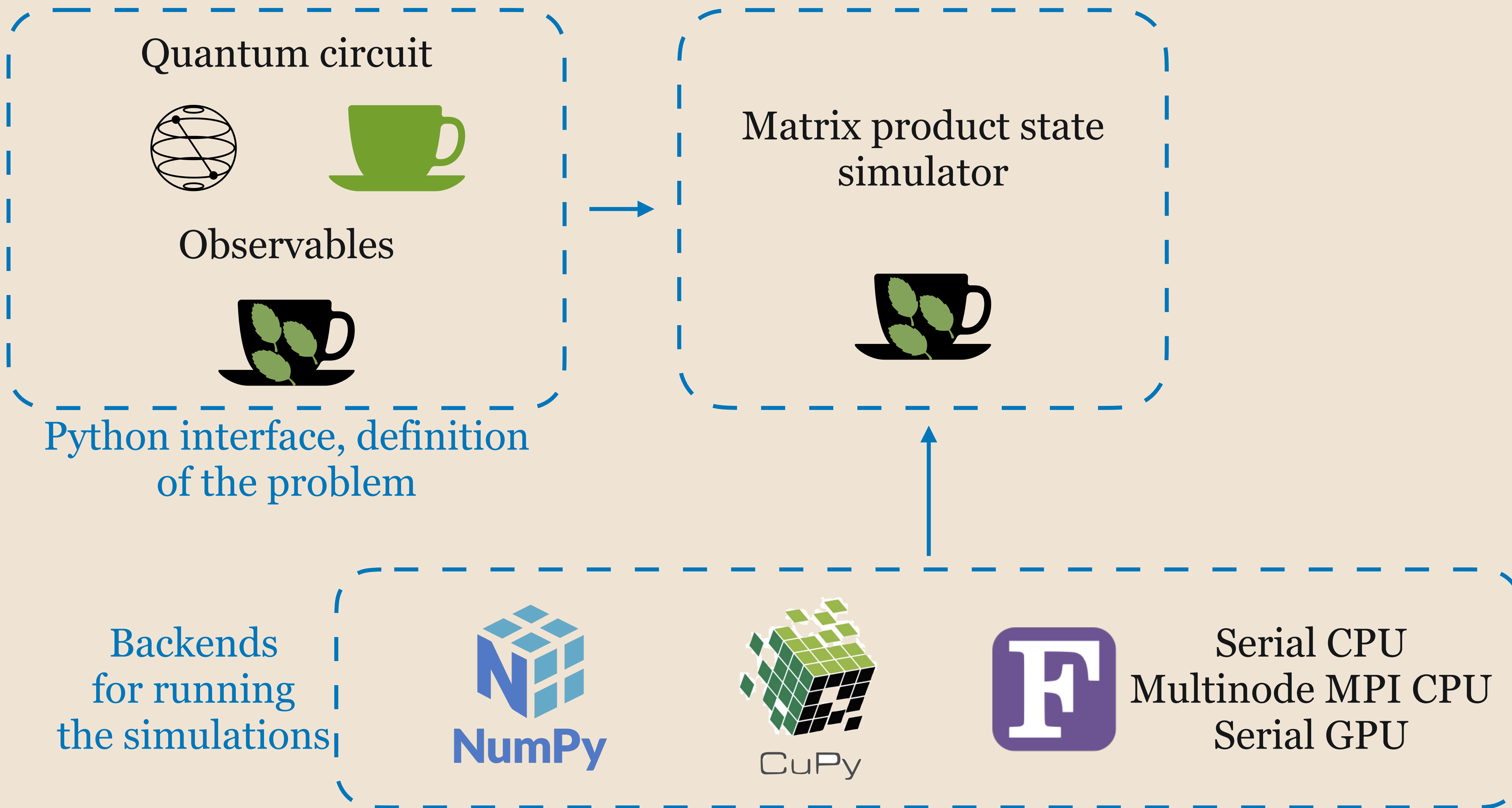
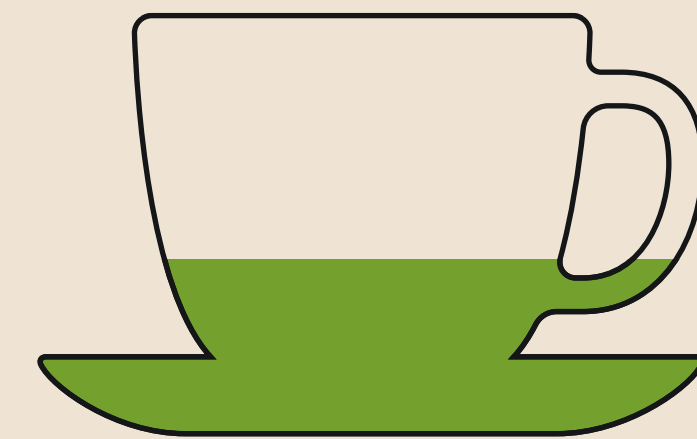
Matrix product state  
simulator



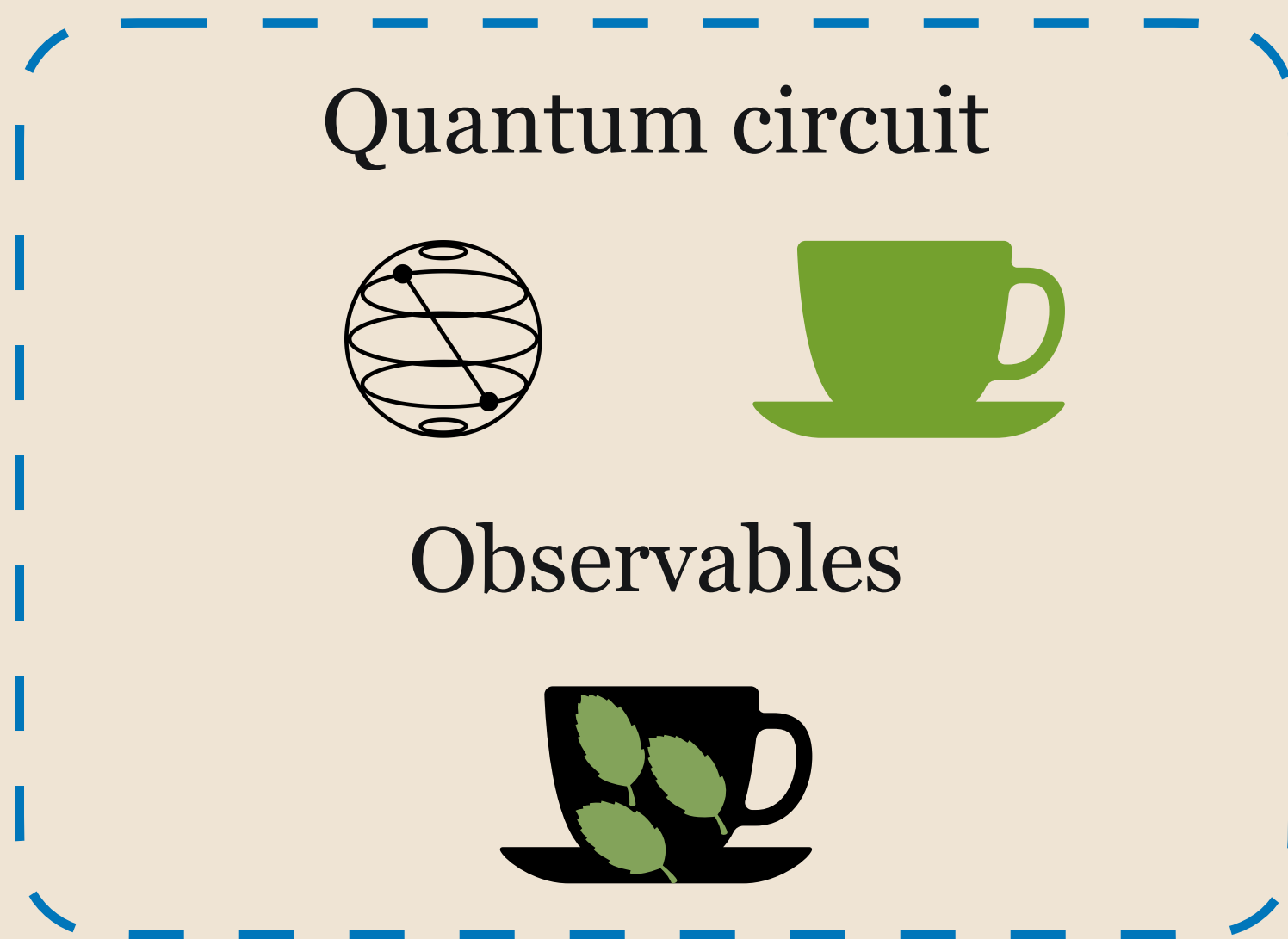
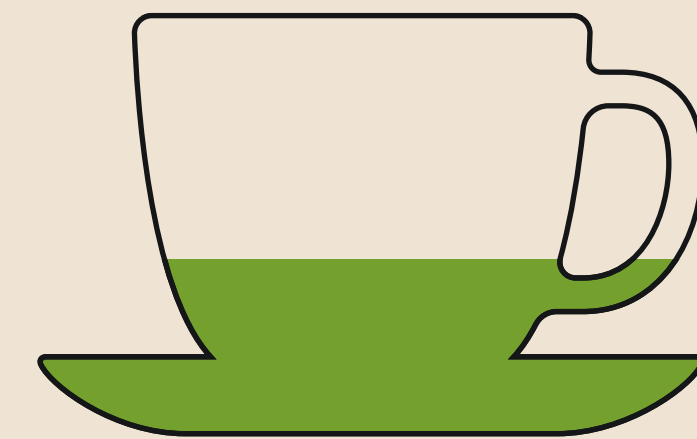
Python interface, definition  
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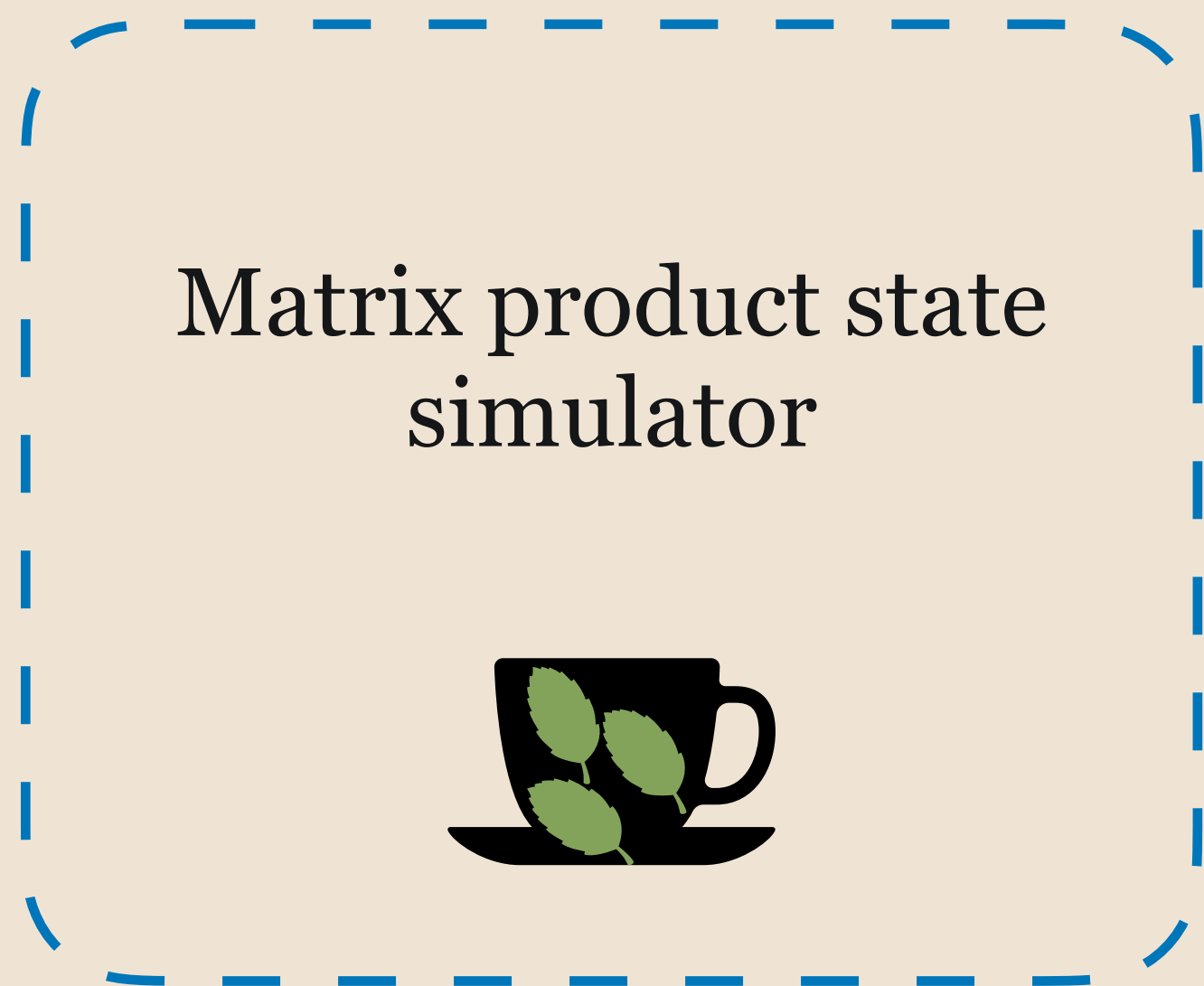
# Quantum Matcha Tea workflow



# Quantum Matcha Tea workflow



Python interface, definition of the problem



Backends for running the simulations



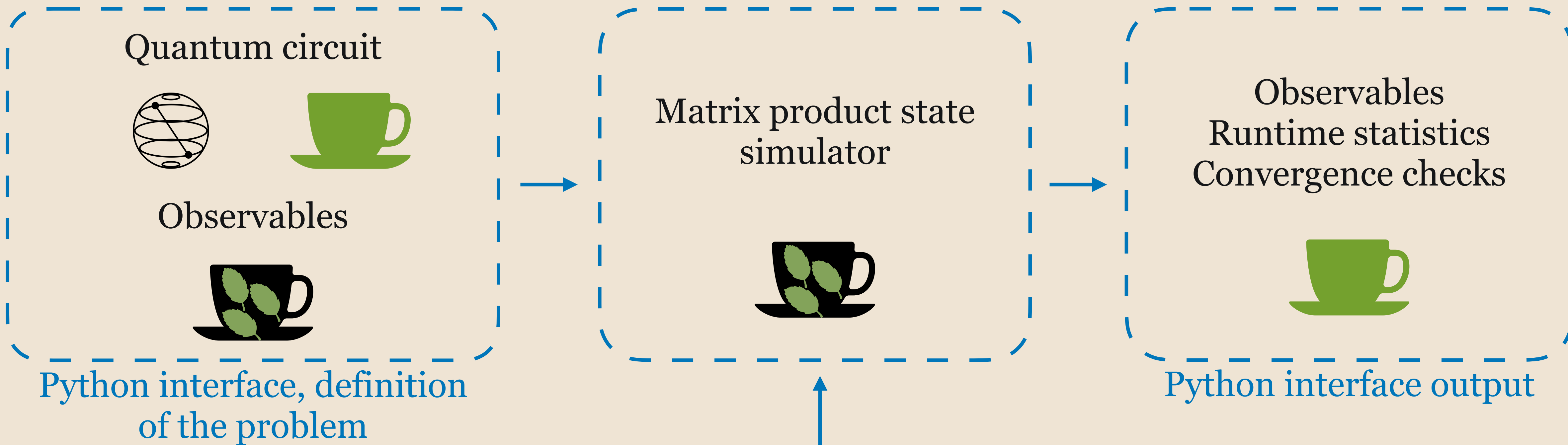
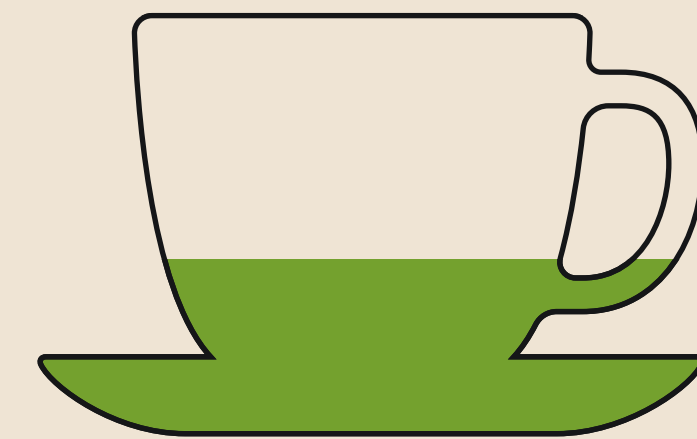
Serial CPU  
Multinode MPI CPU  
Serial GPU

Not public yet





# Quantum Matcha Tea workflow



Backends for running the simulations

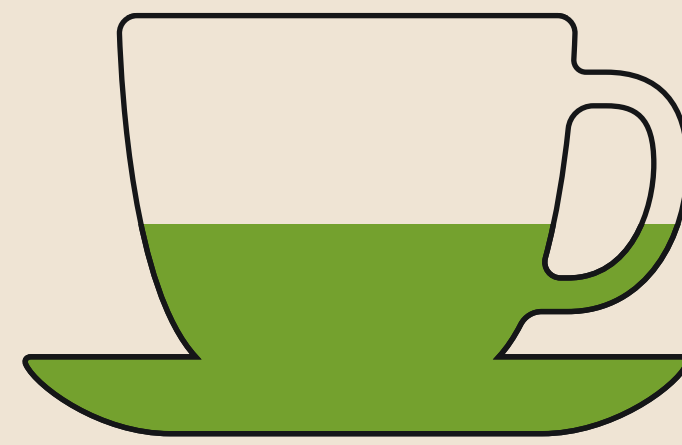


Serial CPU  
Multinode MPI CPU  
Serial GPU

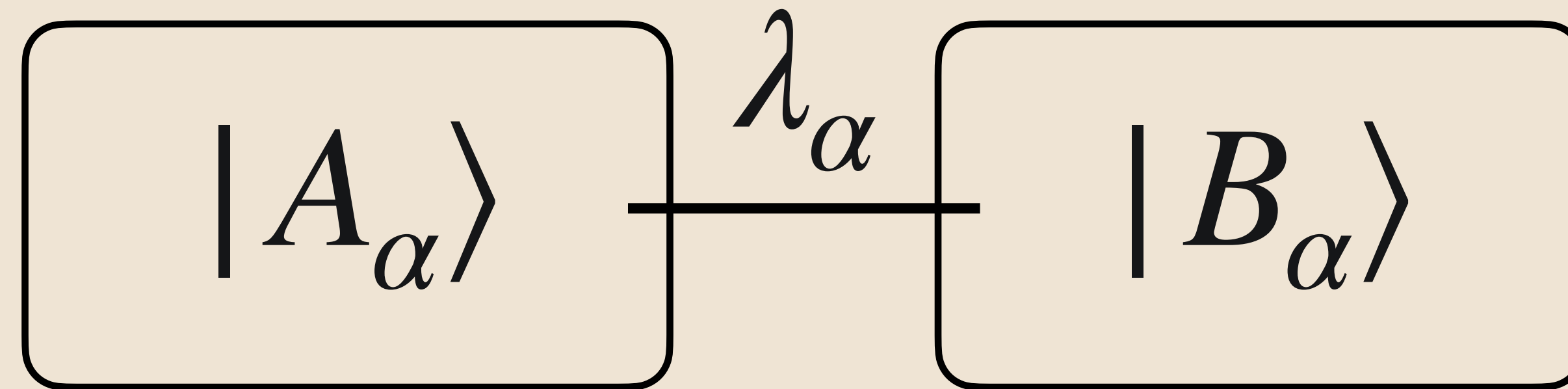
Not public yet



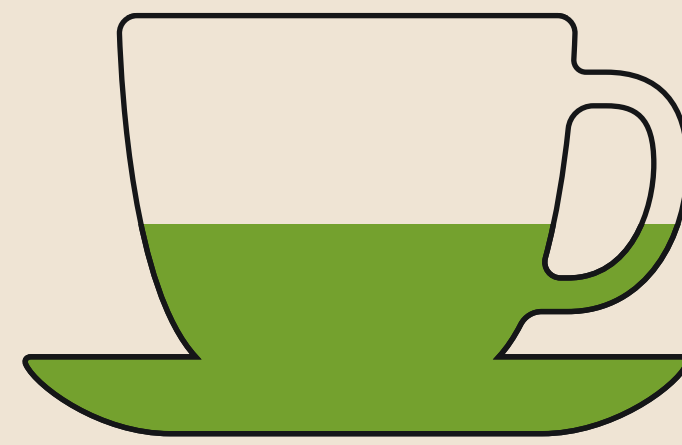
# Convergence checks & error bound



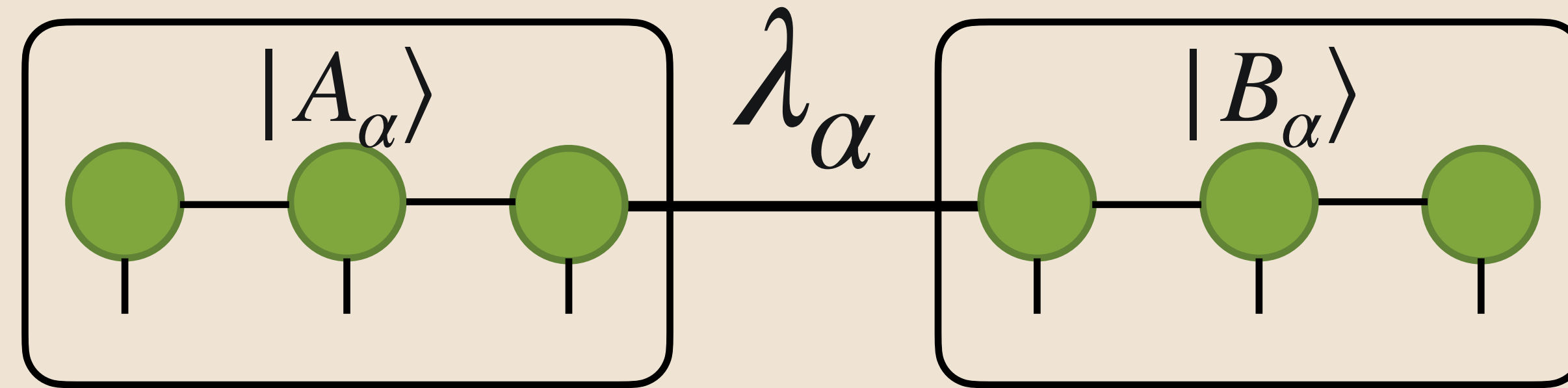
$$|\psi\rangle = \sum_{\alpha=1}^{\chi_T^{i-1}}$$



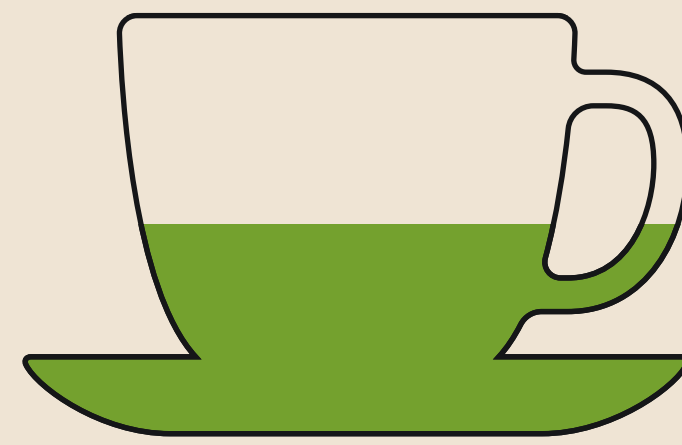
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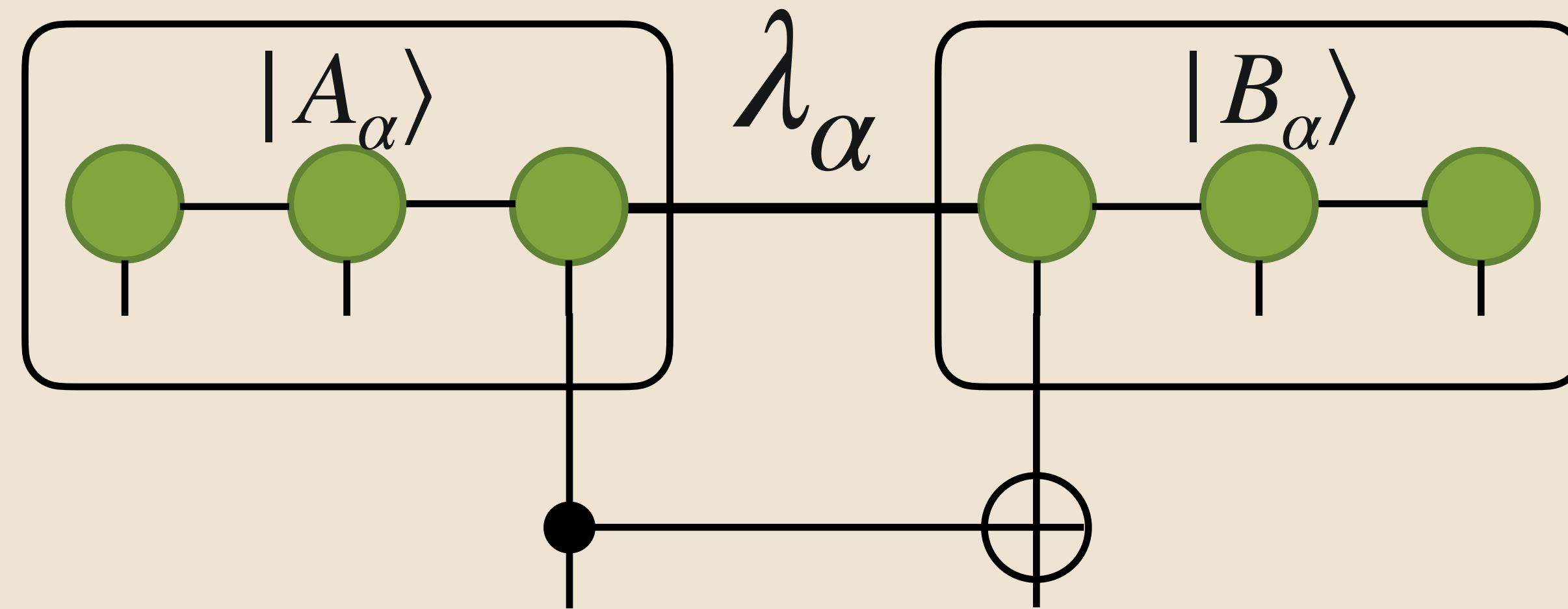
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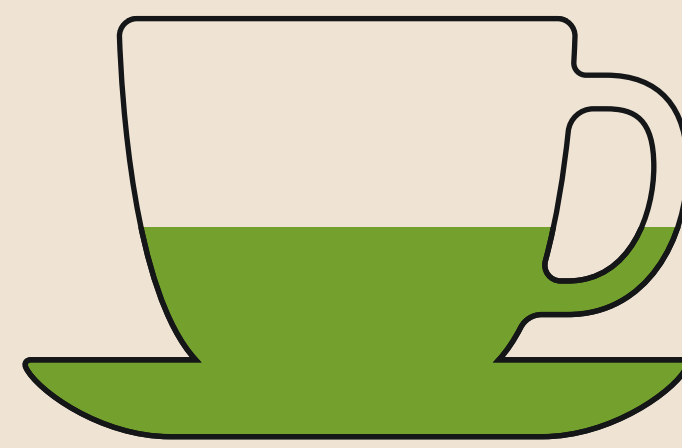
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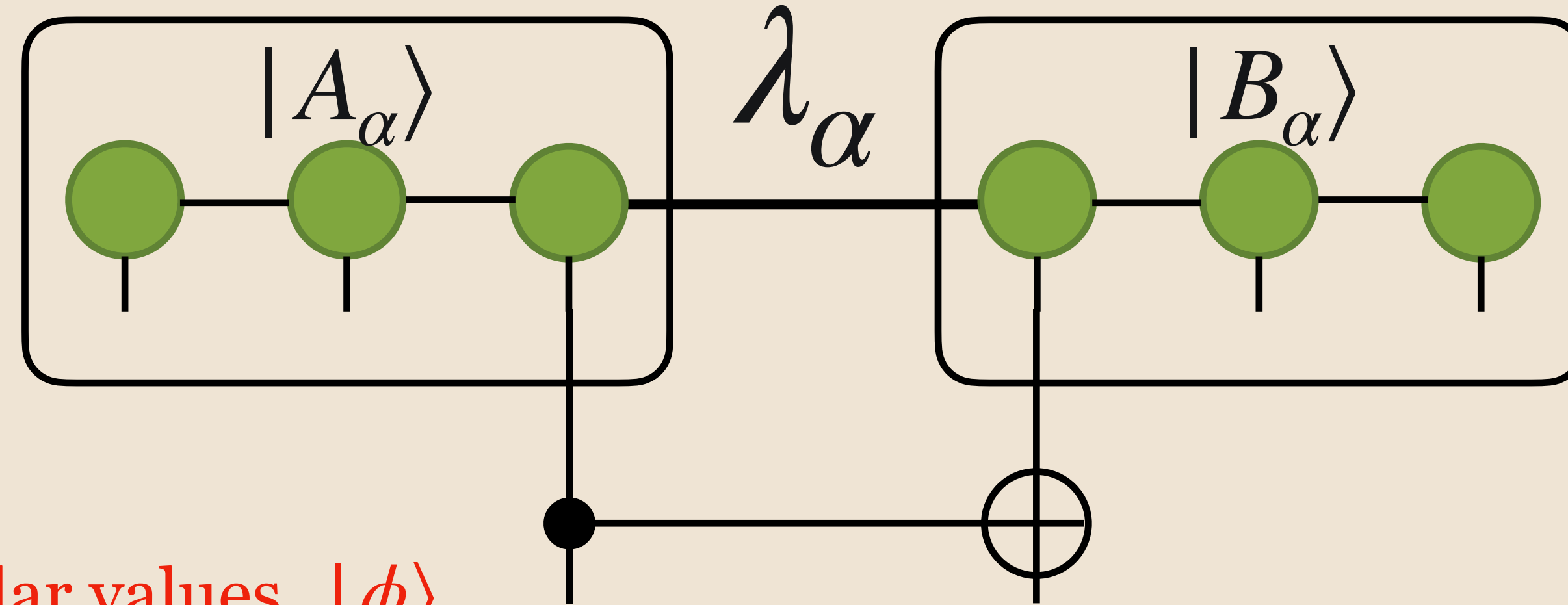
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# Convergence checks & error bound



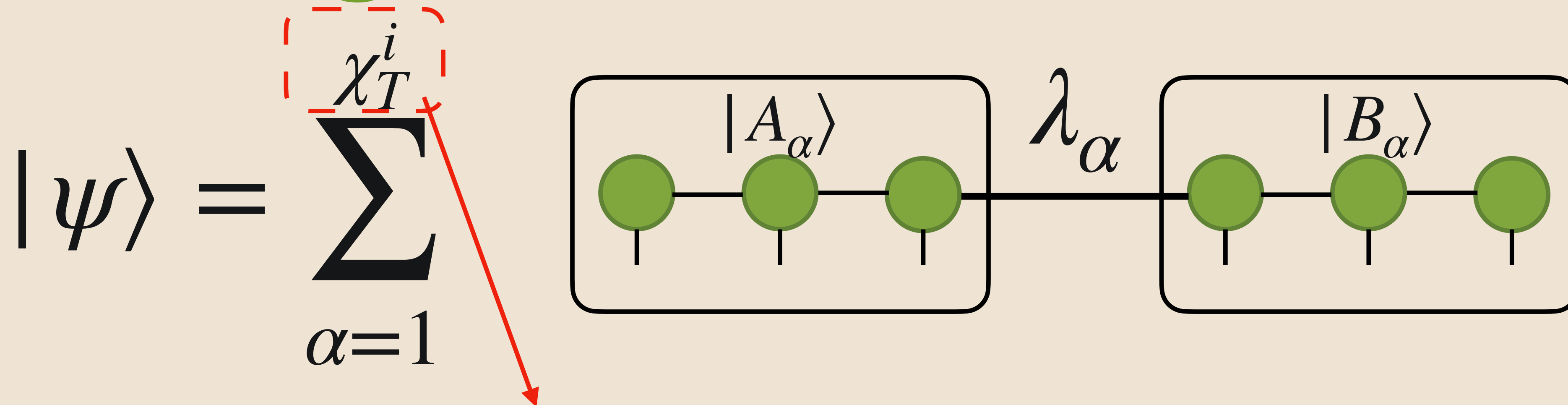
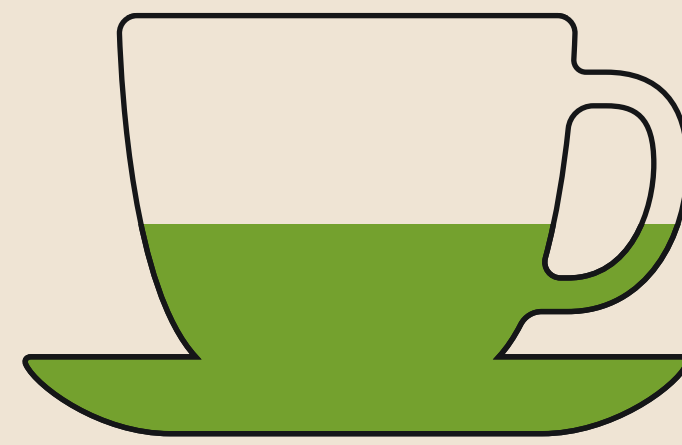
$$|\psi\rangle = \sum_{\alpha=1}^{\chi_T^{i-1}}$$



Only keep highest  $\chi$  singular values,  $|\phi\rangle$



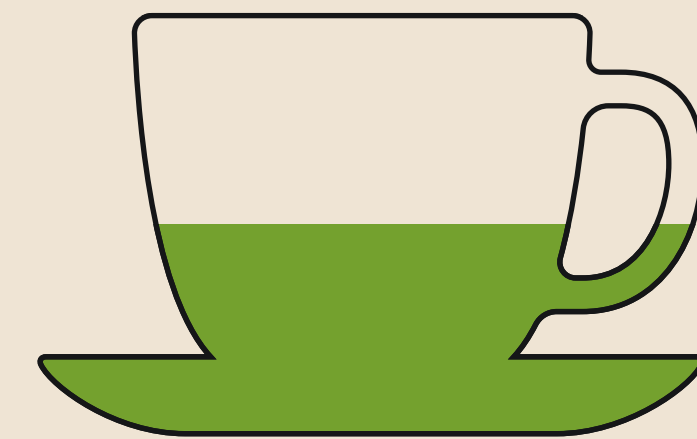
# Convergence checks & error bound



Only keep highest  $\chi$  singular values,  $|\phi\rangle$



# Convergence checks & error bound



$$|\psi\rangle = \sum_{\alpha=1}^{\chi_T^i} \lambda_{\alpha} |A_{\alpha}\rangle |B_{\alpha}\rangle$$

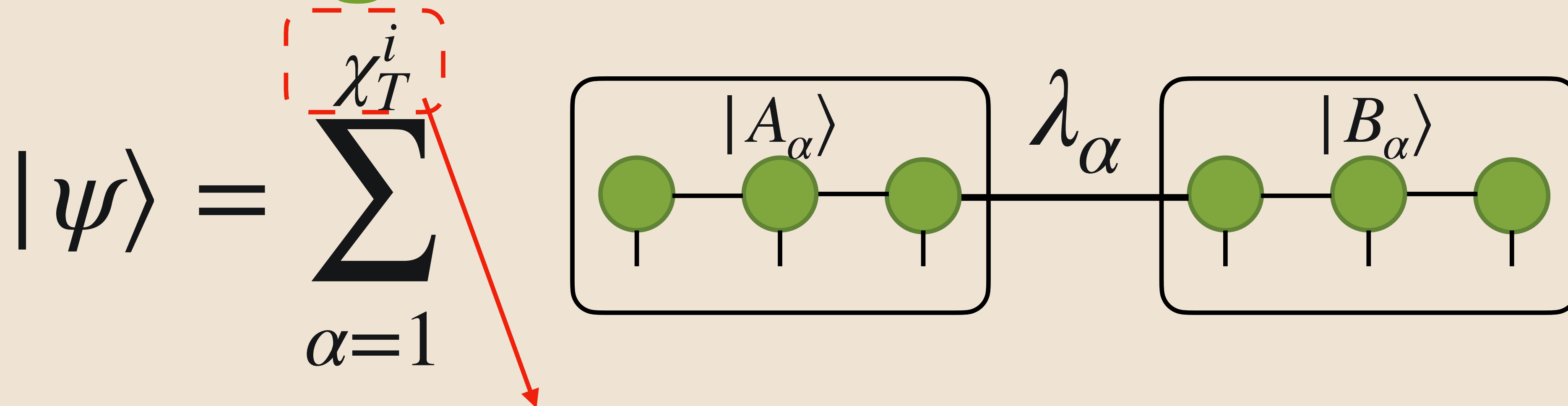
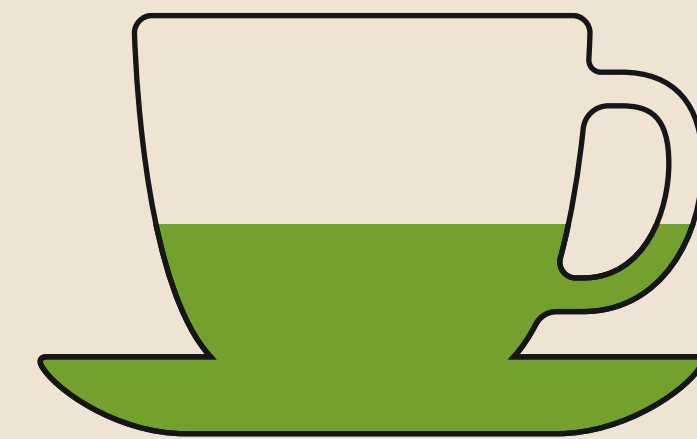
Only keep highest  $\chi$  singular values,  $|\phi\rangle$

Fidelity of the state

$$\mathcal{F}_i(\chi) = |\langle\psi|\phi\rangle|^2 = \left| 1 - \sum_{\alpha=\chi+1}^{\chi_T^i} \lambda_{\alpha}^2 \right|^2$$



# Convergence checks & error bound



Only keep highest  $\chi$  singular values,  $|\phi\rangle$

Fidelity of the state

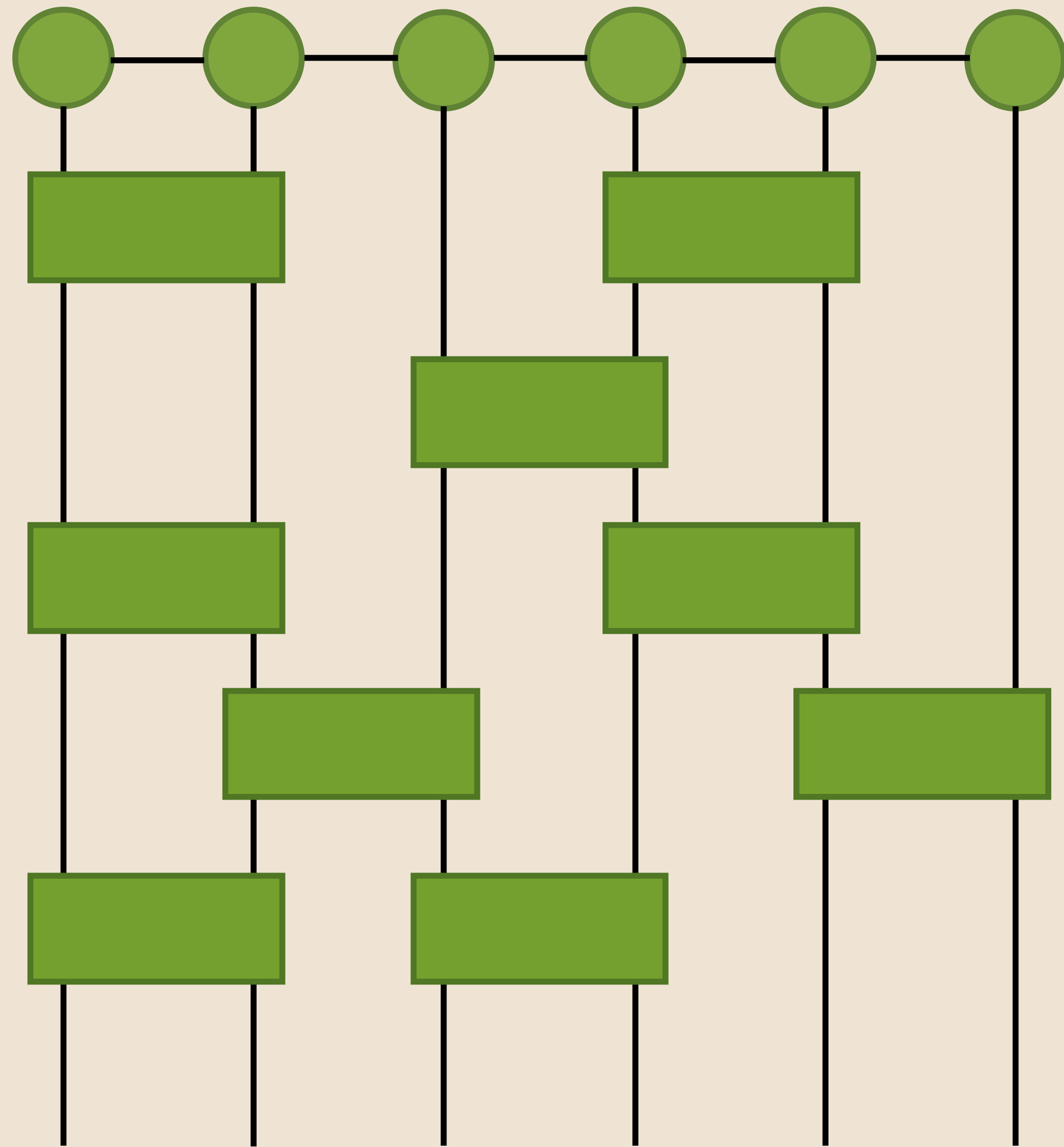
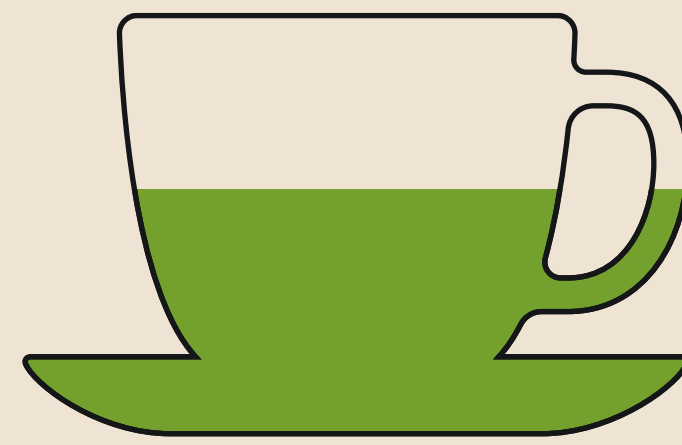
$$\mathcal{F}_i(\chi) = \left| \langle \psi | \phi \rangle \right|^2 = \left| 1 - \sum_{\alpha=\chi+1}^{\chi_T^i} \lambda_{\alpha}^2 \right|^2$$

Computed during the simulation

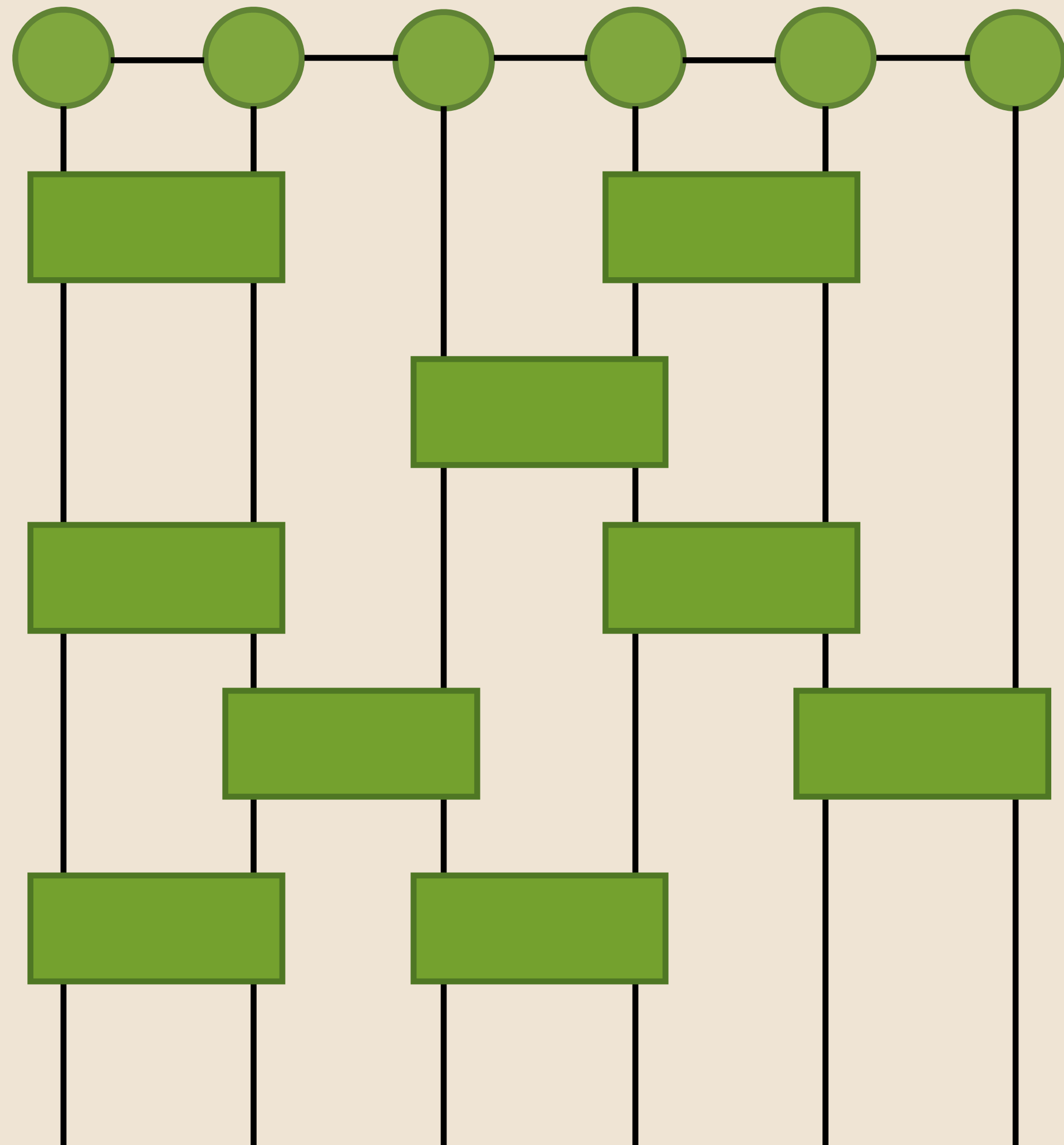
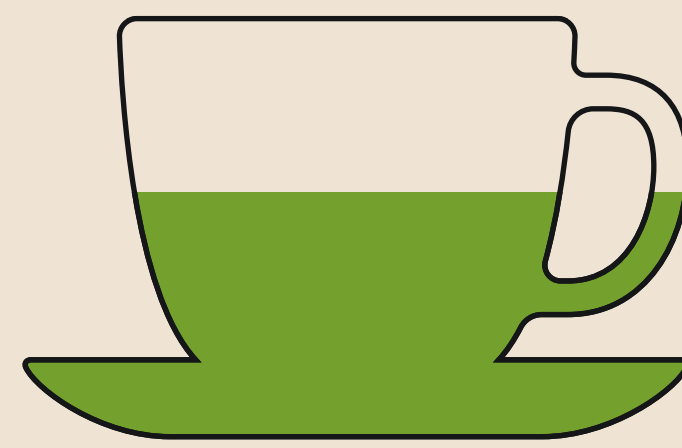




# Convergence and error checks



# Convergence and error checks

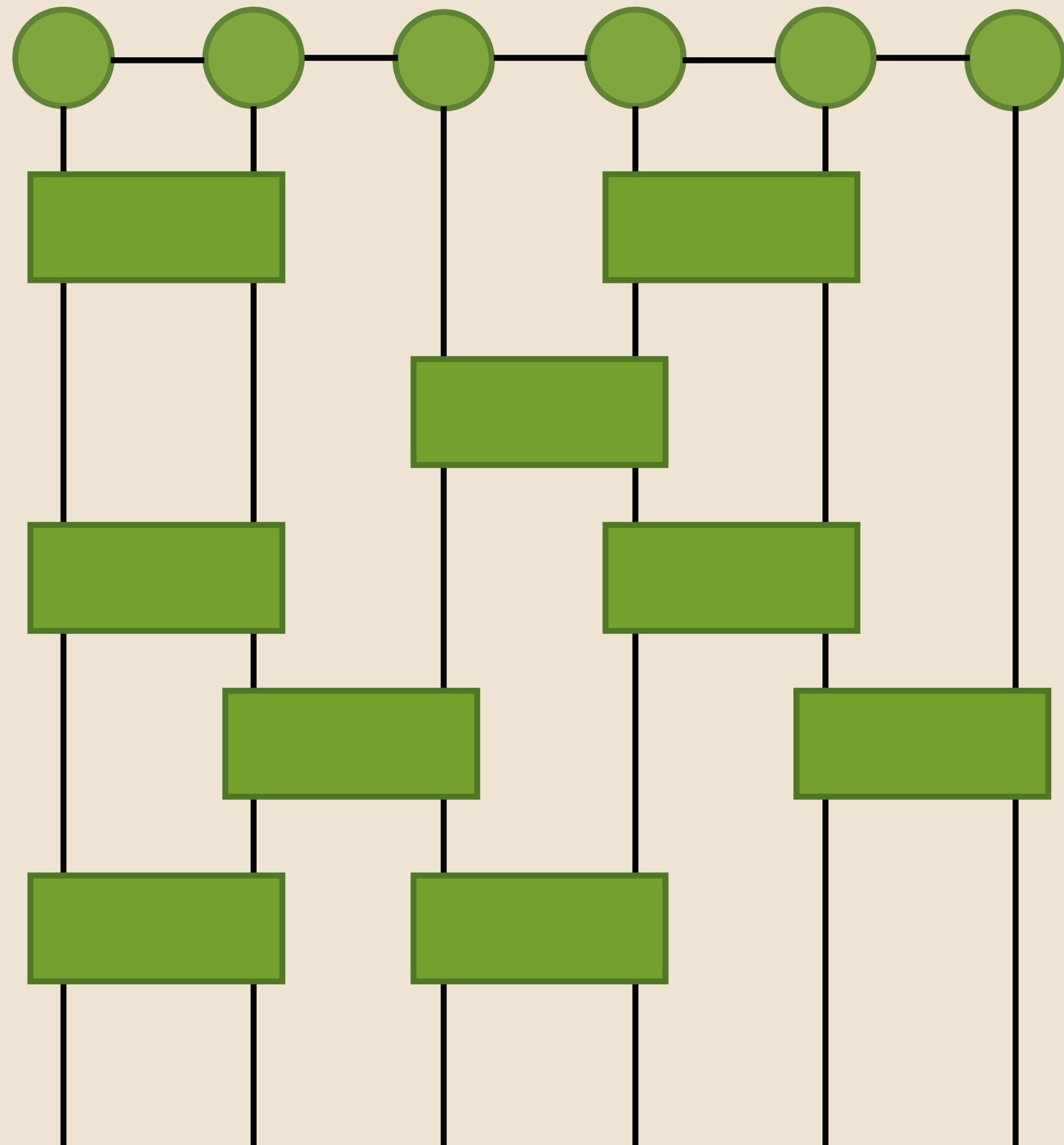
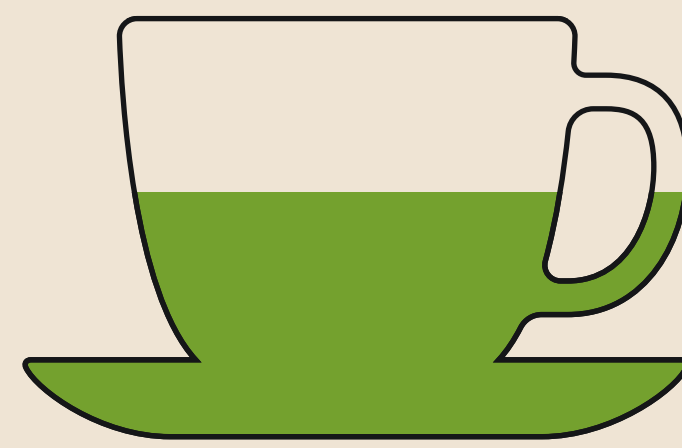


Fidelity of the state  
after a **single** gate

$$F_i(\chi) = \left| 1 - \sum_{\alpha=\chi+1}^{\chi_T^i} \lambda_{\alpha}^2 \right|^2$$



# Convergence and error checks



Fidelity of the state after a **single** gate

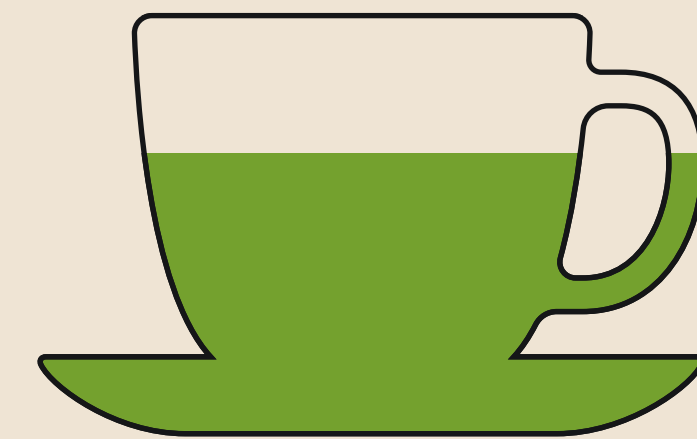
$$\mathcal{F}_i(\chi) = \left| 1 - \sum_{\alpha=\chi+1}^{\chi_T^i} \lambda_{\alpha}^2 \right|^2$$

Fidelity at the end of the simulation

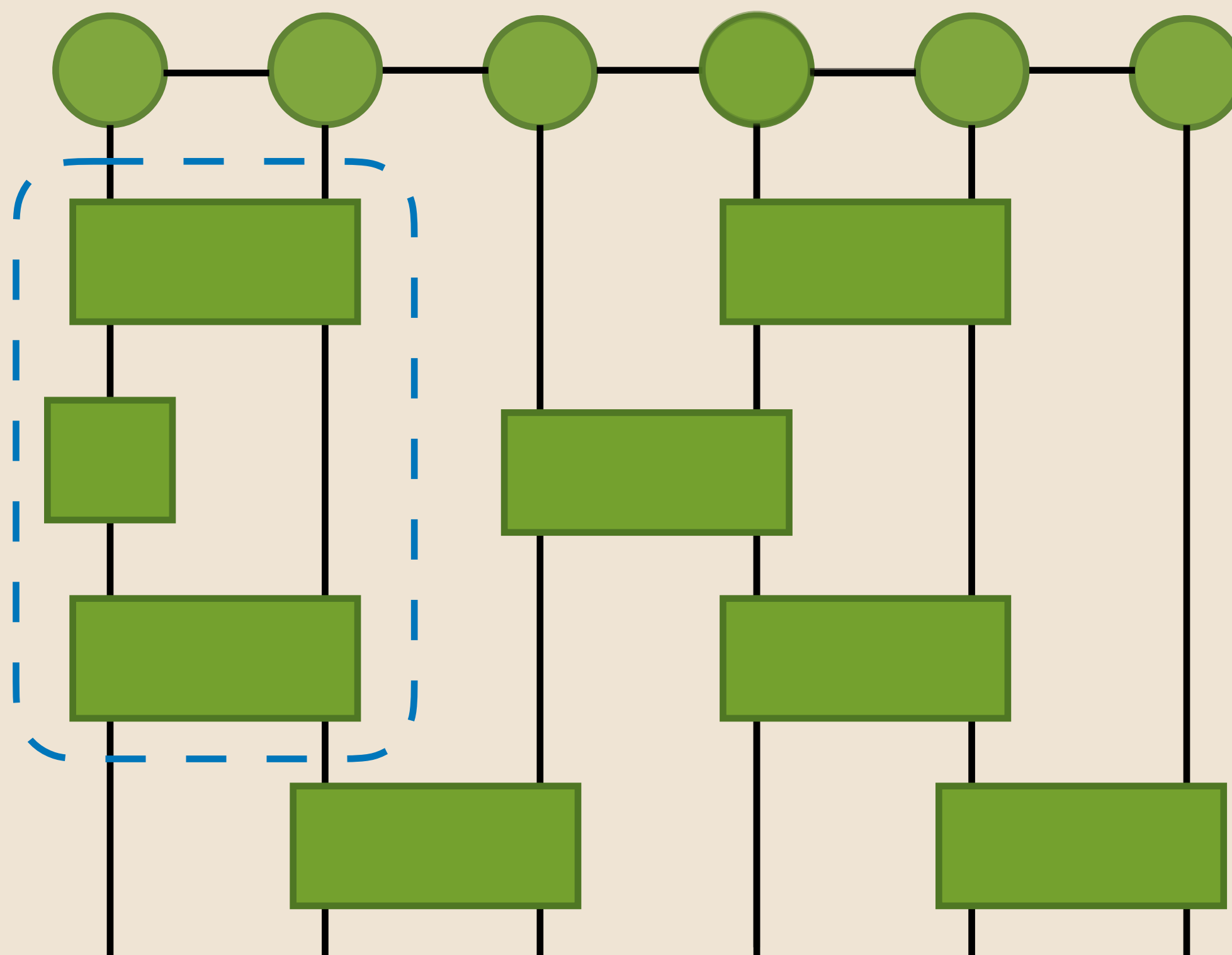
$$\mathcal{F}^{tot}(\chi) \geq \prod_i \mathcal{F}_i(\chi)$$



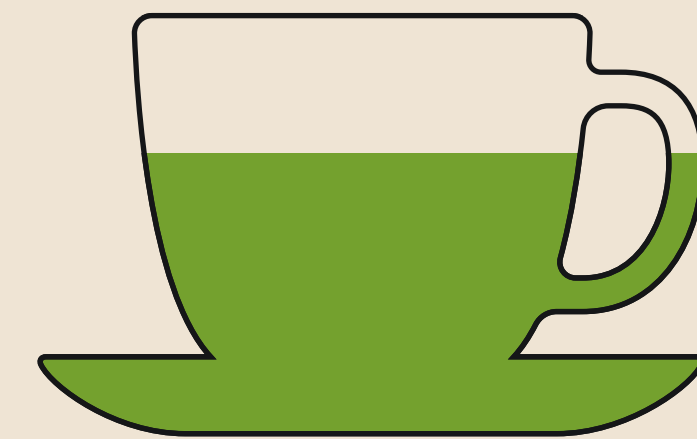
# Optimisation & parallelism



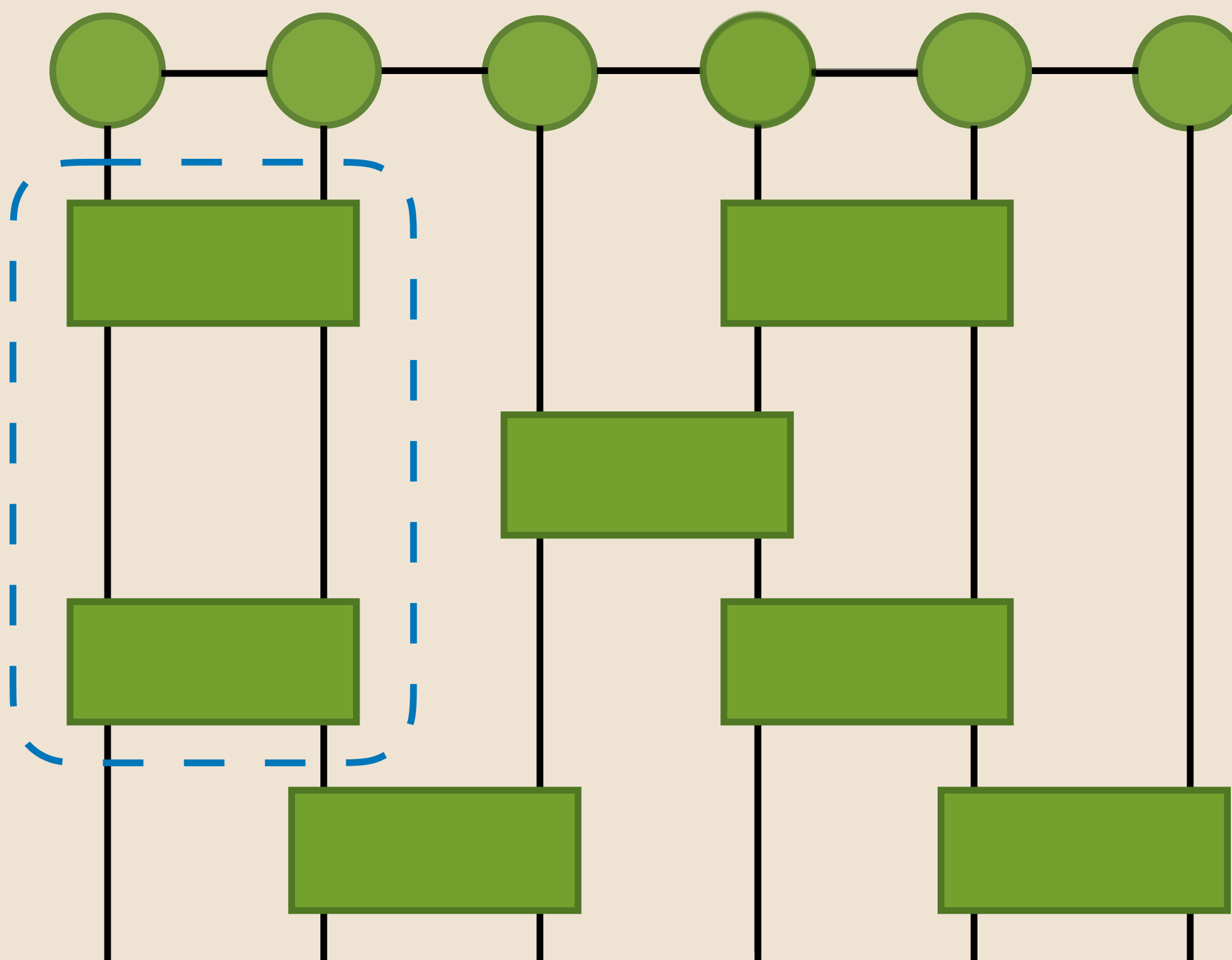
Gates acts on the same qubits:  
we contract gates together and only after with state



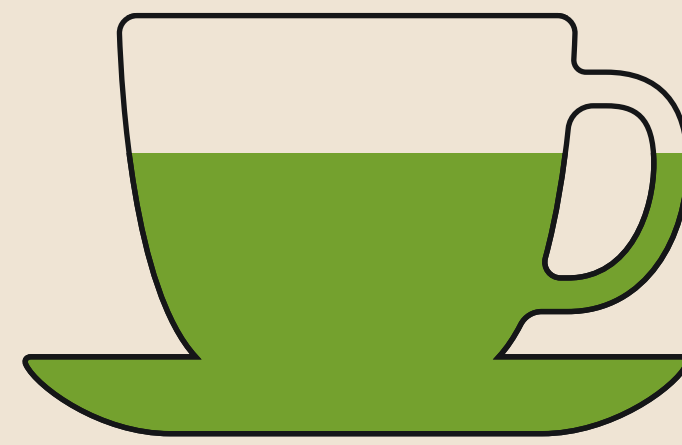
# Optimisation & parallelism



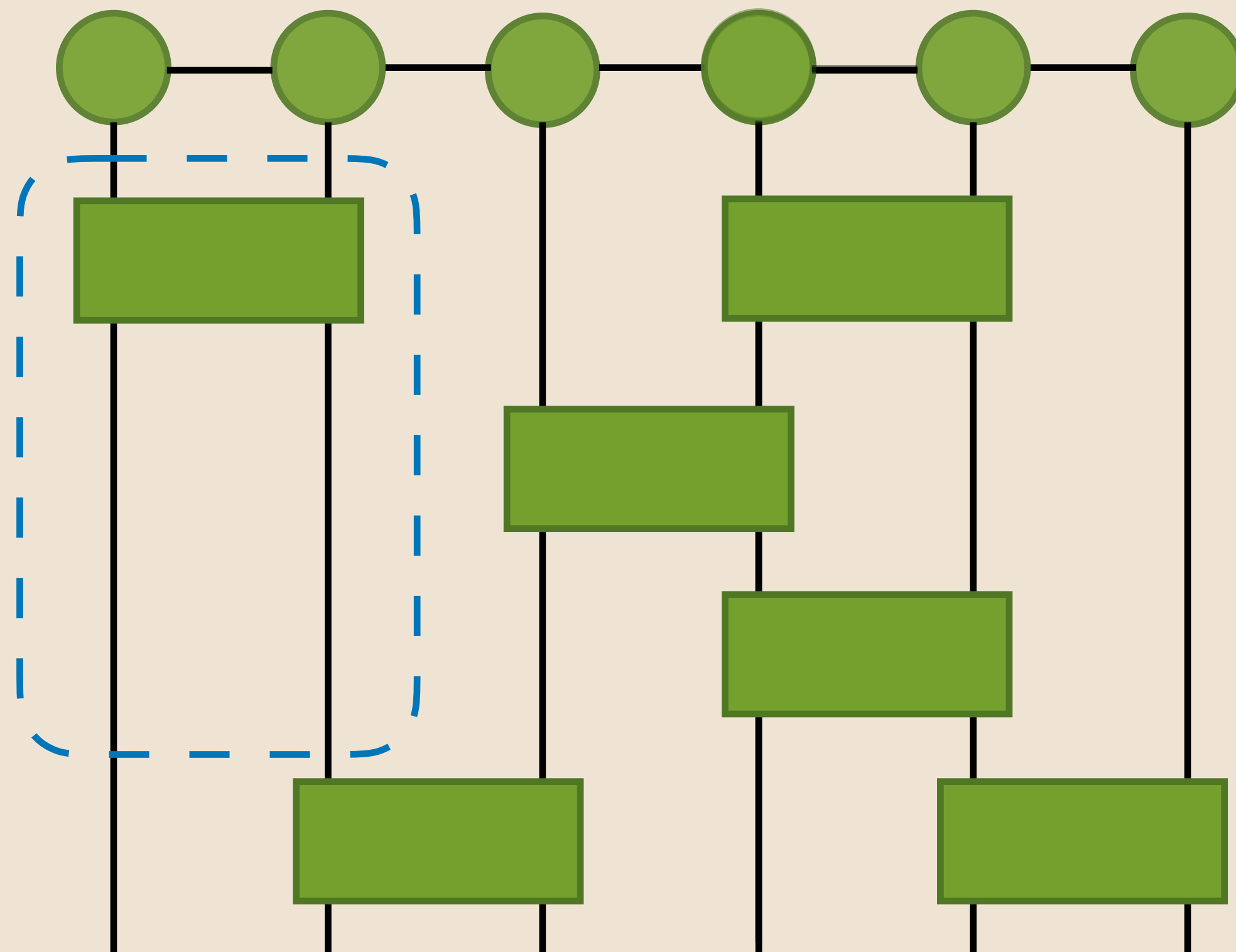
Gates acts on the same qubits:  
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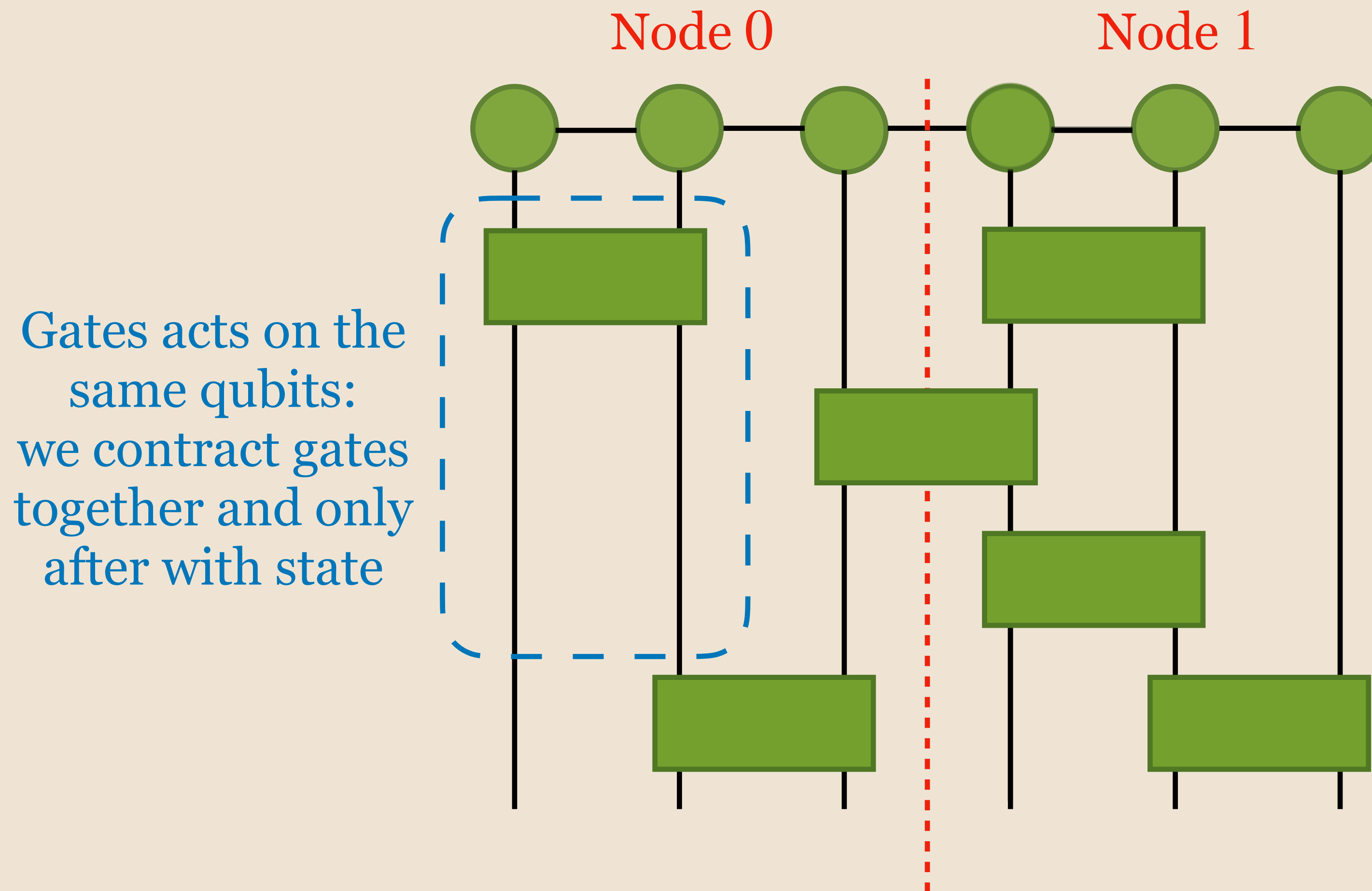
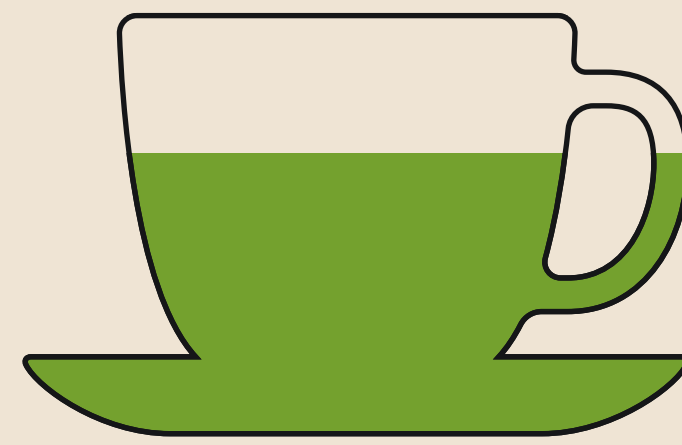
# Optimisation & parallelism



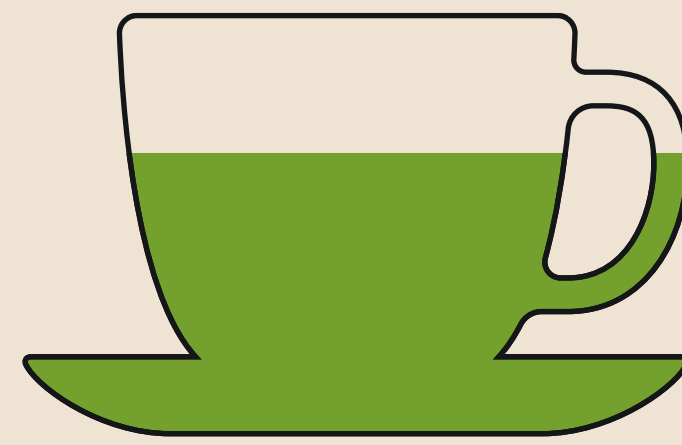
Gates acts on the same qubits:  
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# Optimisation & parallelism

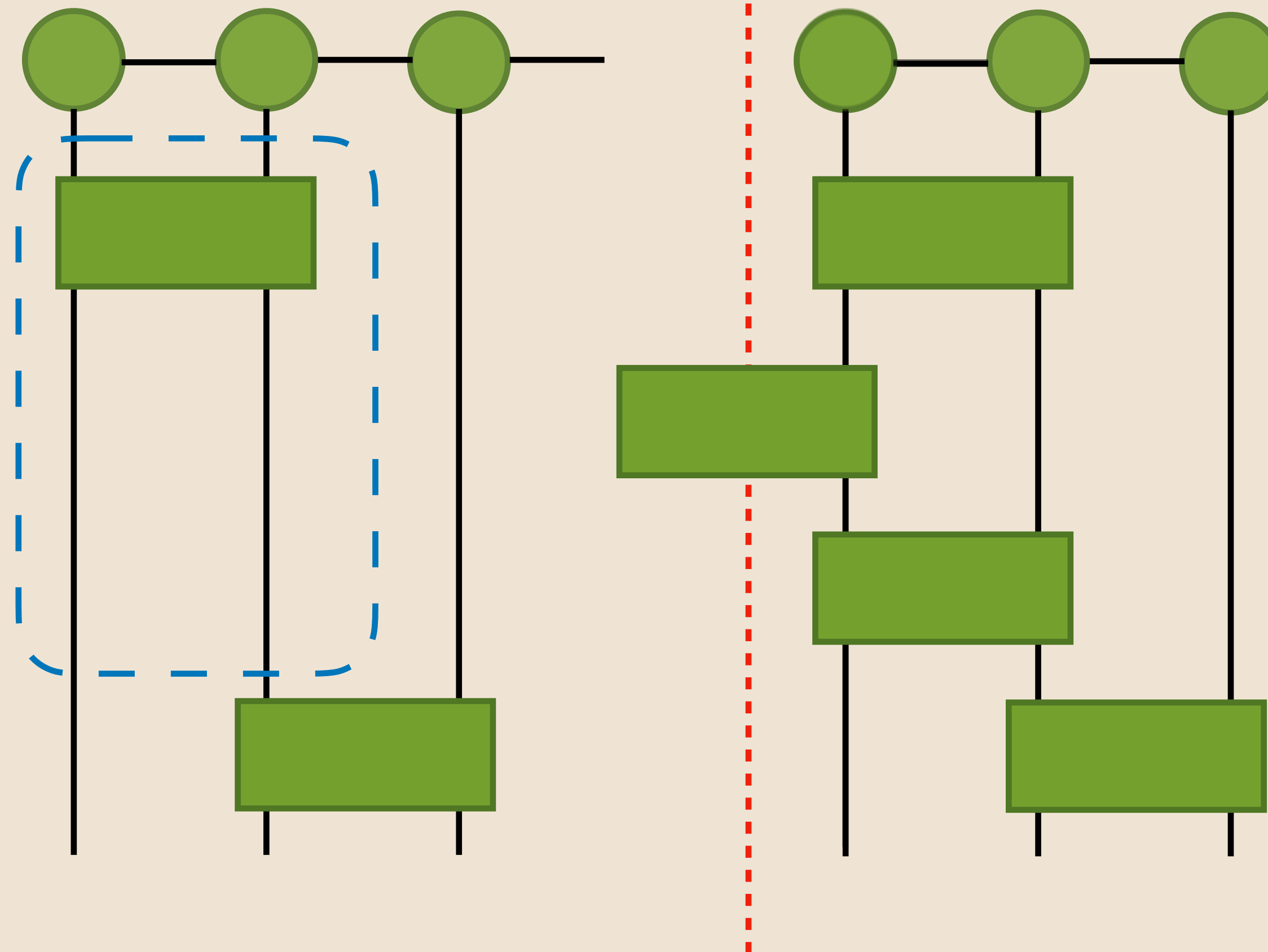


# Optimisation & parallelism



Node 0

Node 1

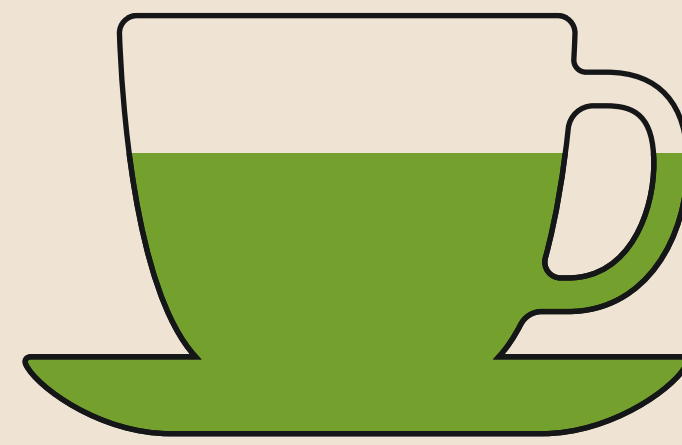


Gates acts on the same qubits: we contract gates together and only after with state





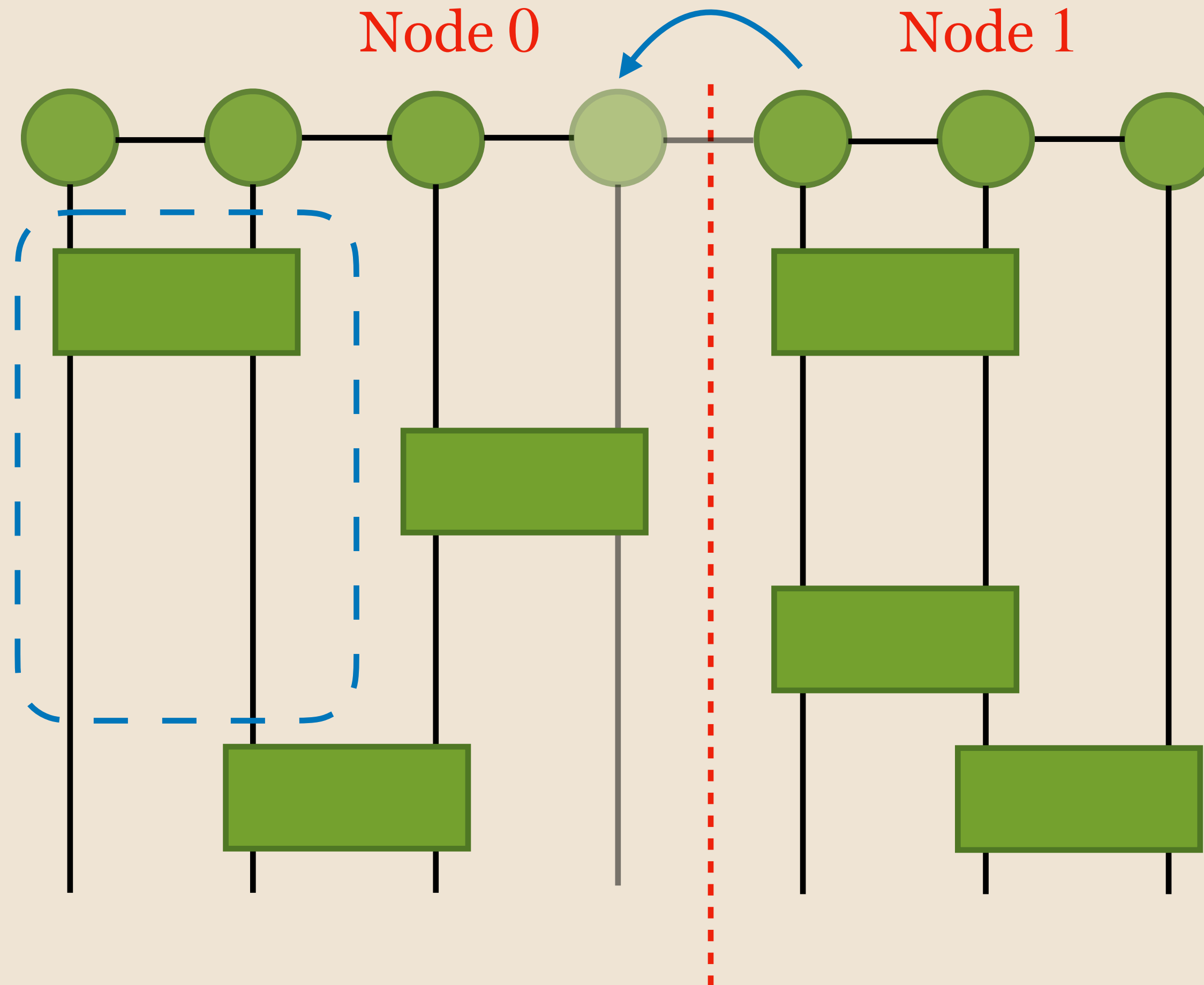
# Optimisation & parallelism



Copy of the qubit state

Node 0

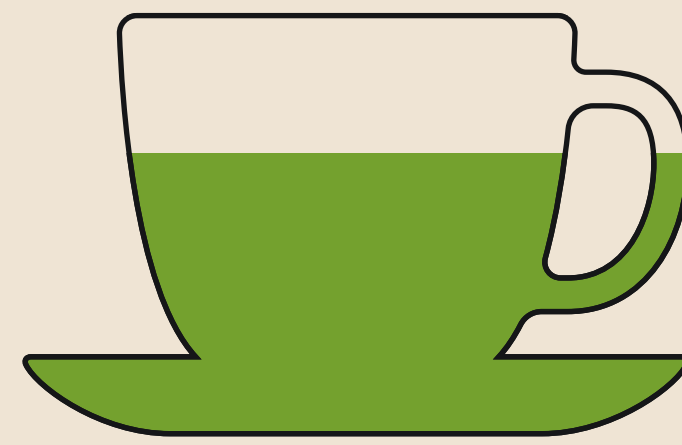
Node 1



Gates acts on the same qubits: we contract gates together and only after with state



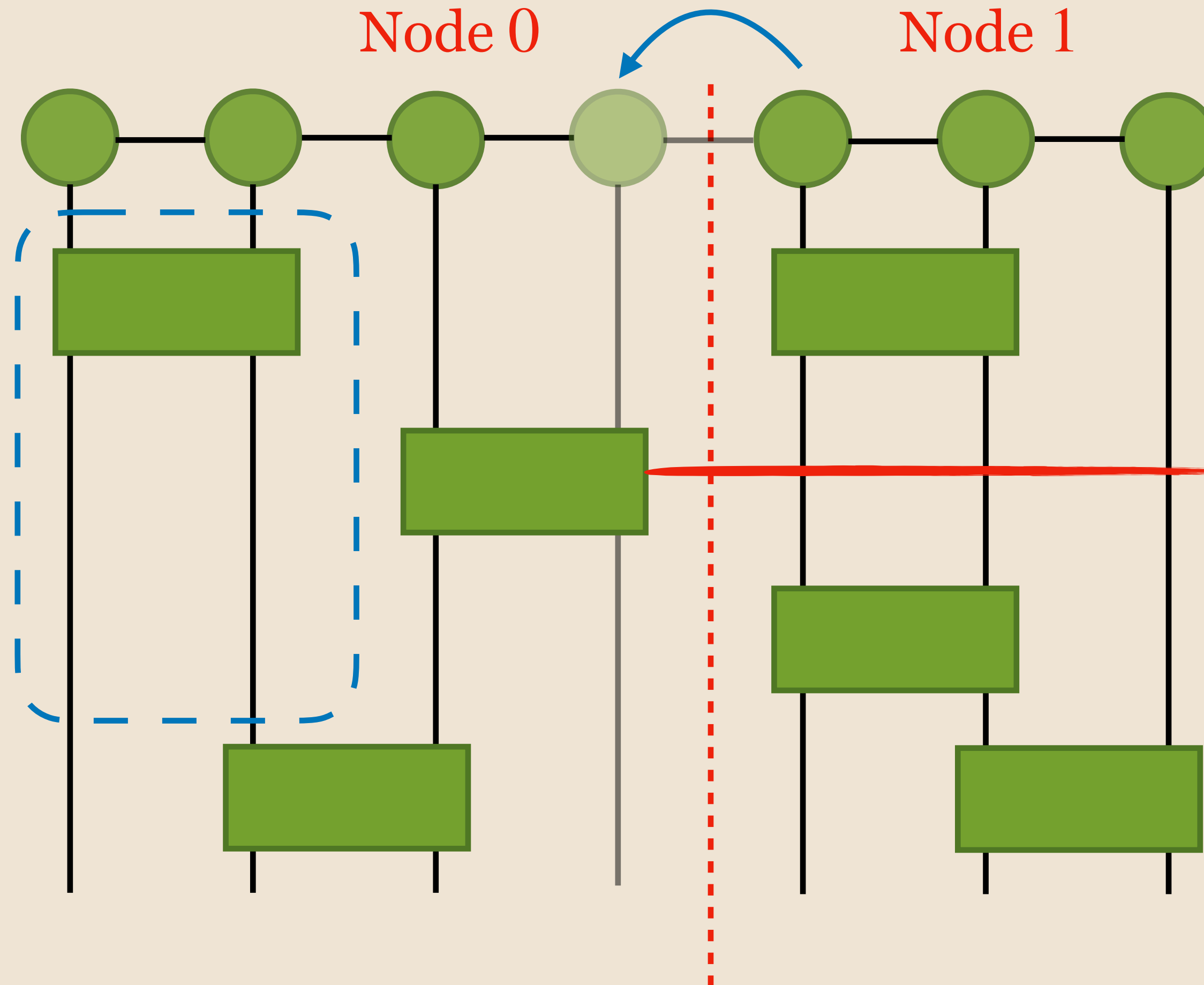
# Optimisation & parallelism



Copy of the qubit state

Node 0

Node 1

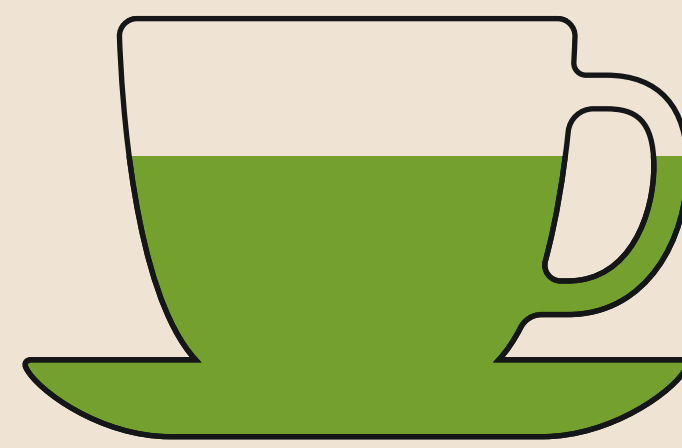


Gates acts on the same qubits: we contract gates together and only after with state

Barrier to wait for the data from node 0



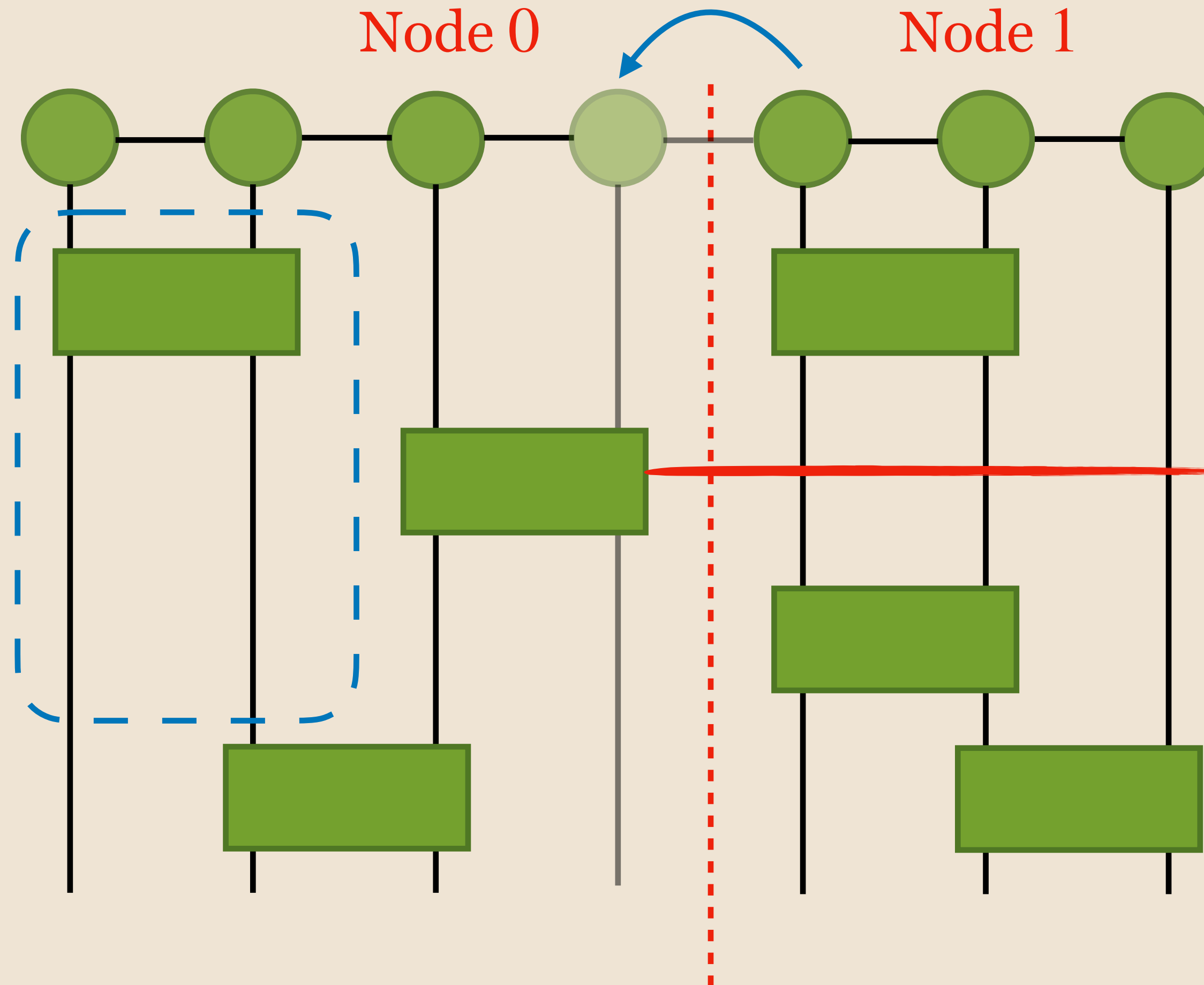
# Optimisation & parallelism



Copy of the qubit state

Node 0

Node 1



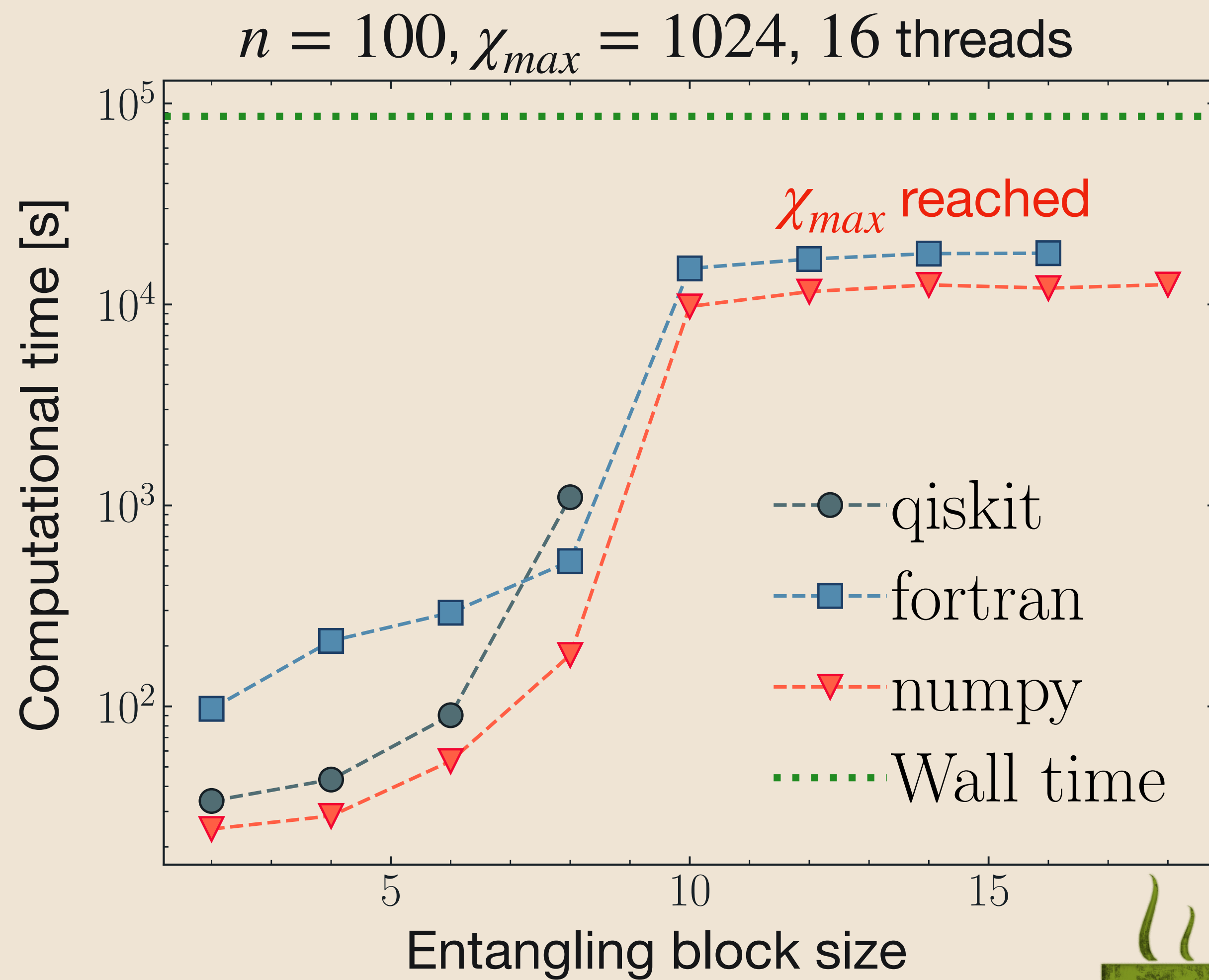
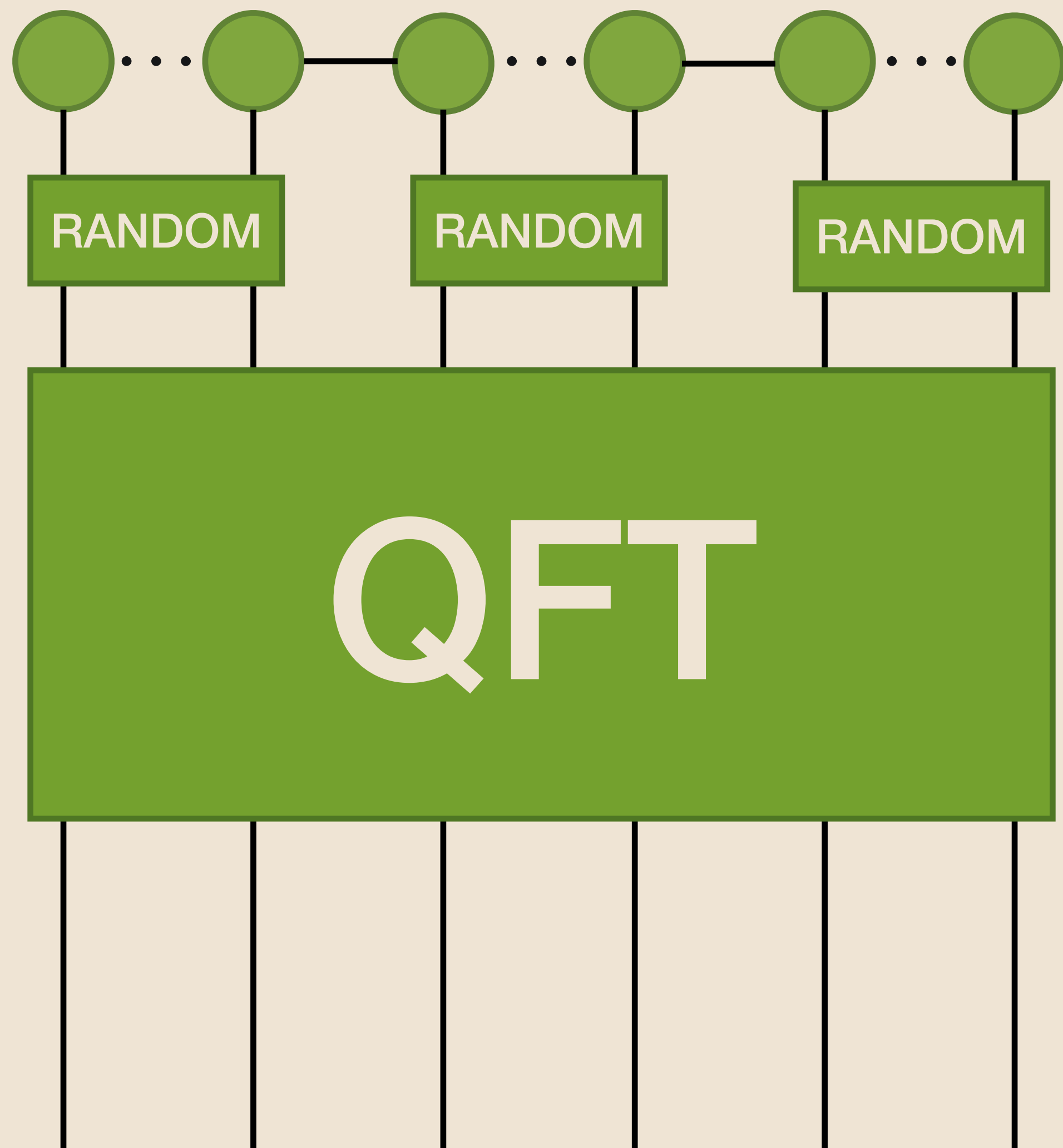
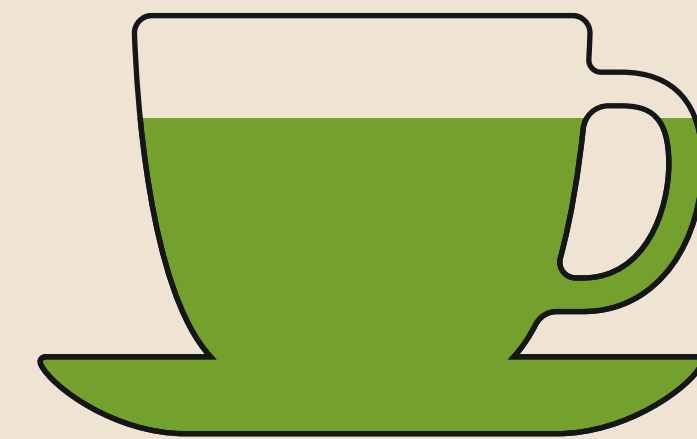
Gates acts on the same qubits: we contract gates together and only after with state

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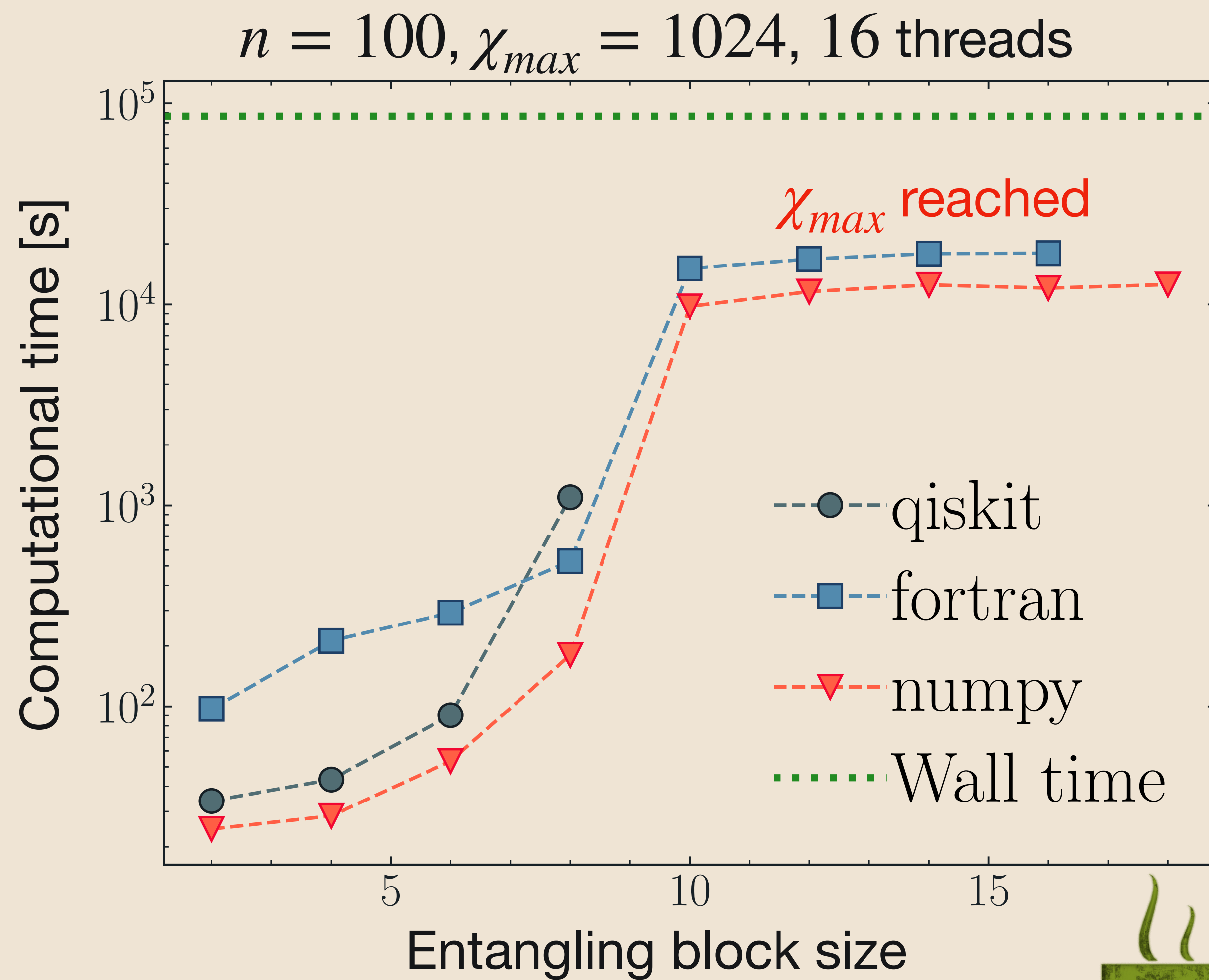
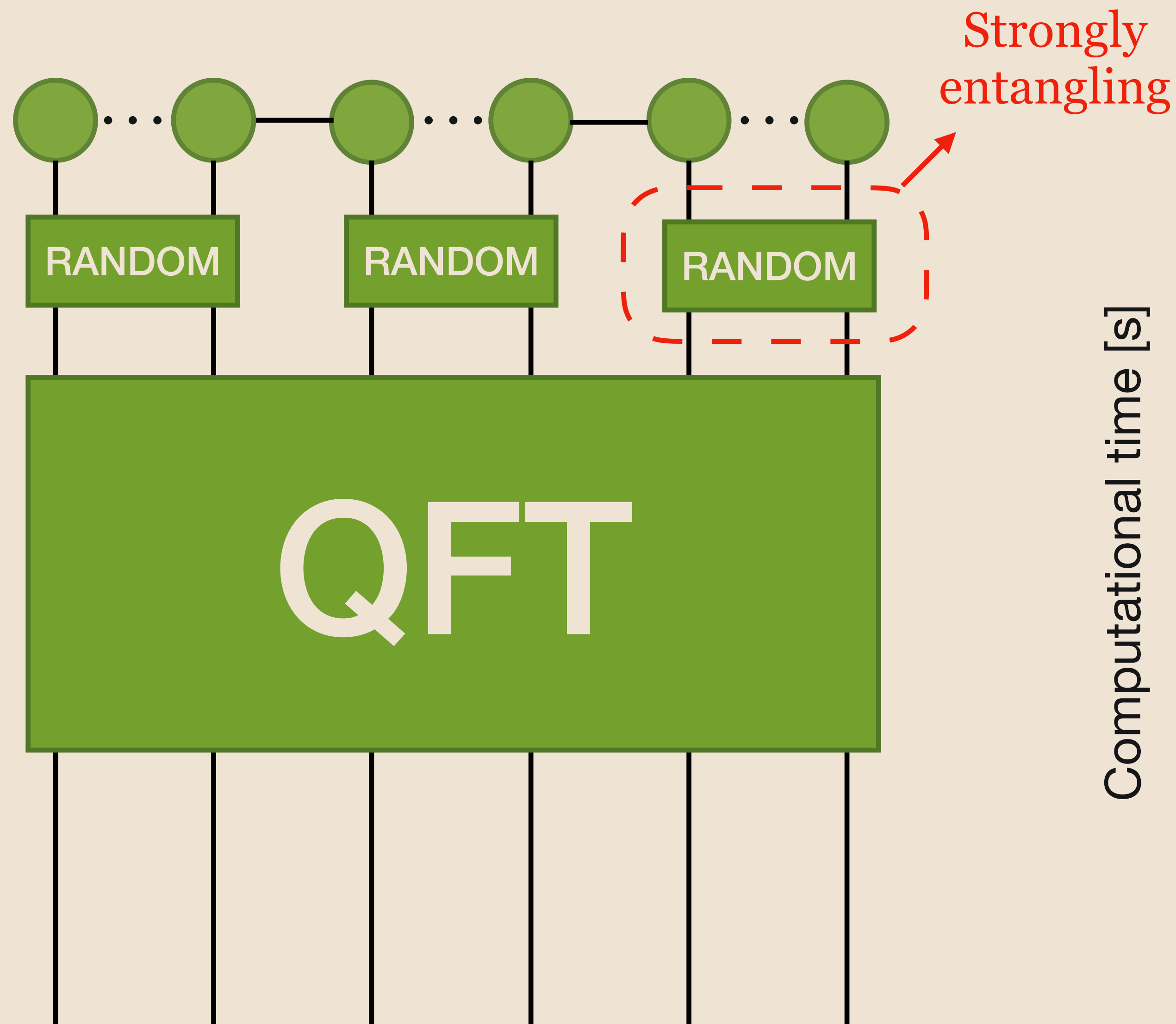
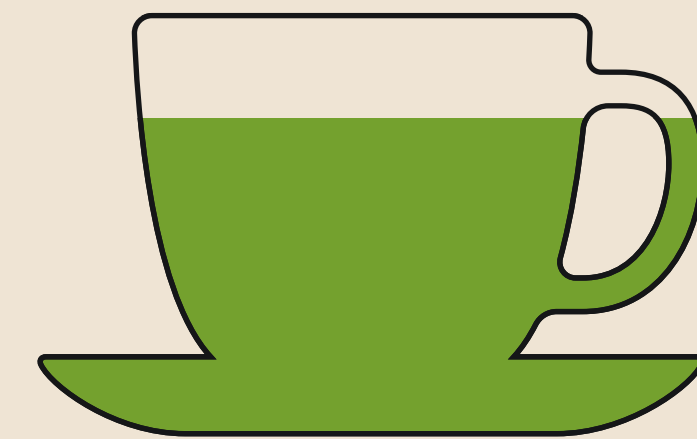
A GOOD PARALLEL SCALING INCREASES ERRORS DUE TO AN ALGORITHMIC SUBTLETY



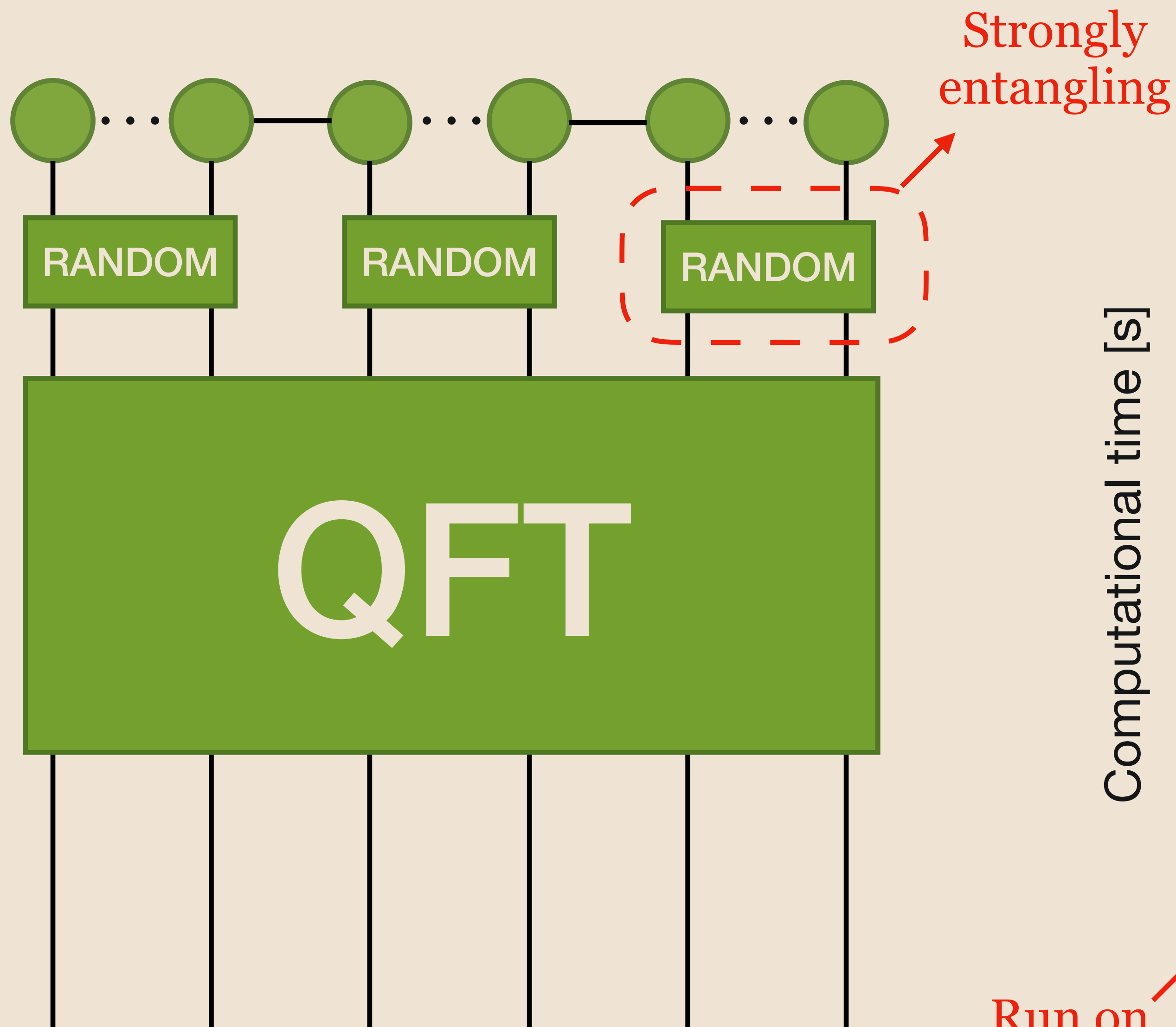
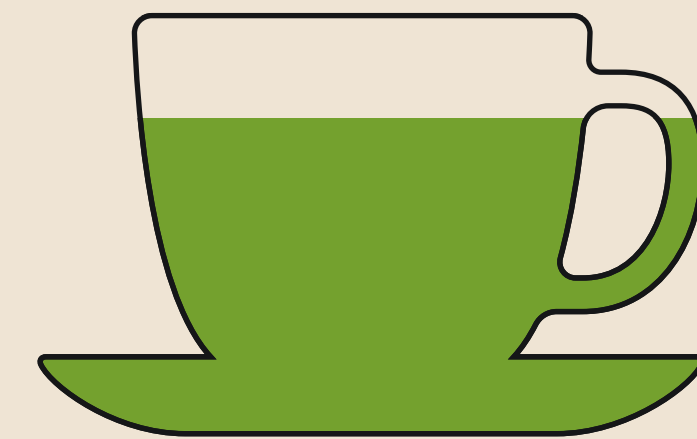
# Benchmarks



# Benchmarks

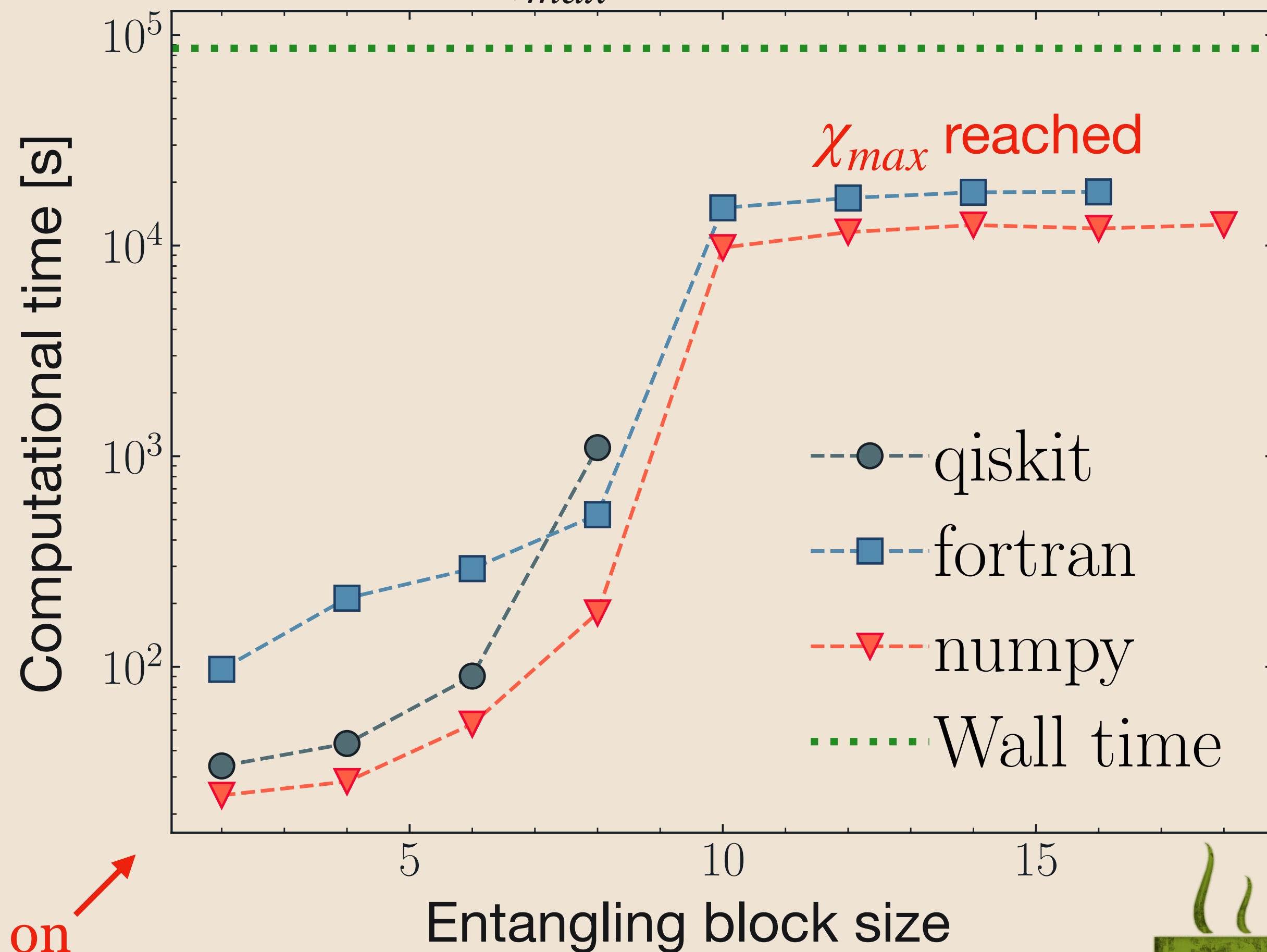


# Benchmarks

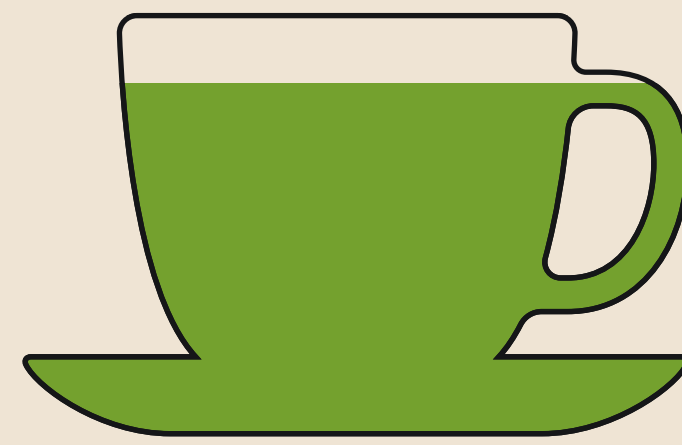


Run on Galileo100

$n = 100, \chi_{max} = 1024, 16$  threads



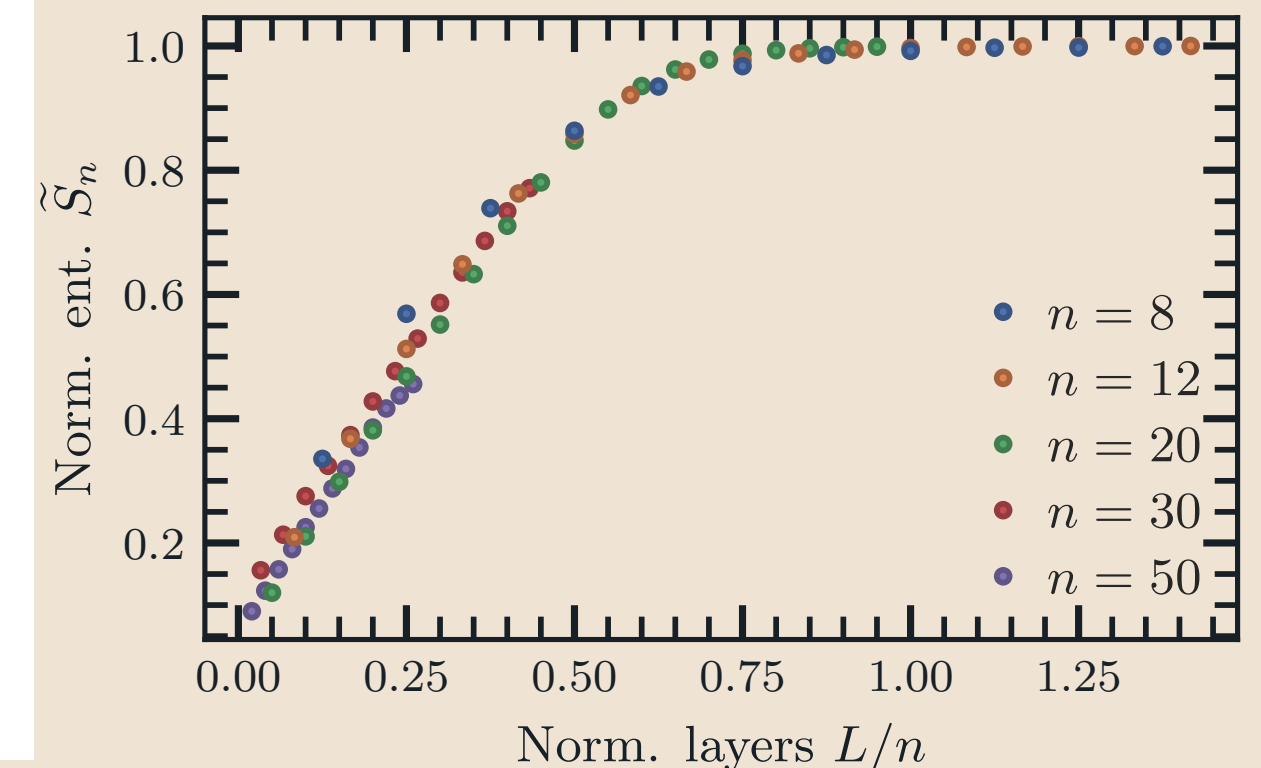
# Applications



## Entanglement entropy production in QNN

Ballarin, Marco, et al. arXiv:2206.02474

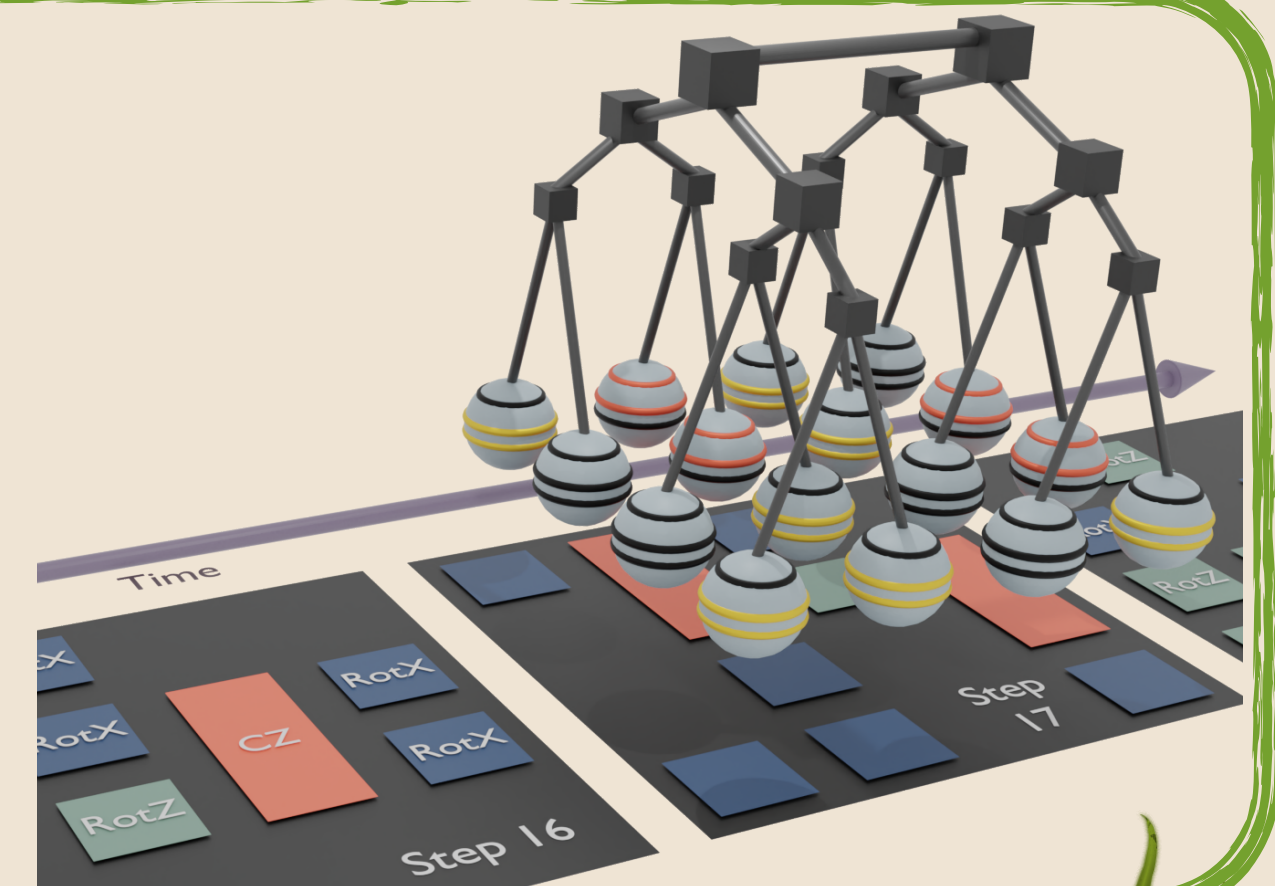
- Simulations up to 50 qubits
- Bond dimension of 4096
- 11h of runtime on Galileo100



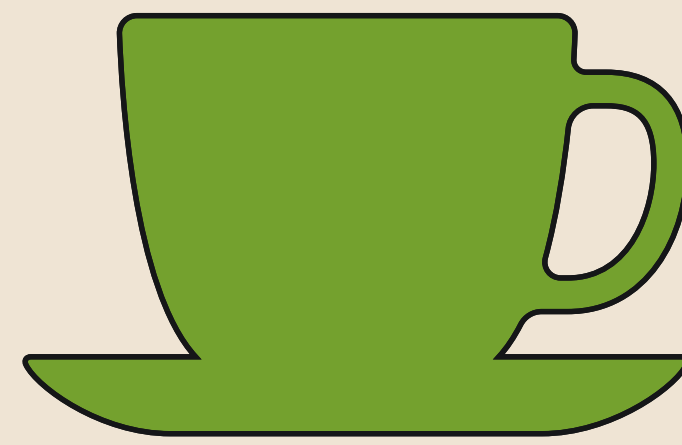
## Ab initio two-dimensional digital twin for quantum computer

Jaschke, Daniel, et al. arXiv:2210.03763

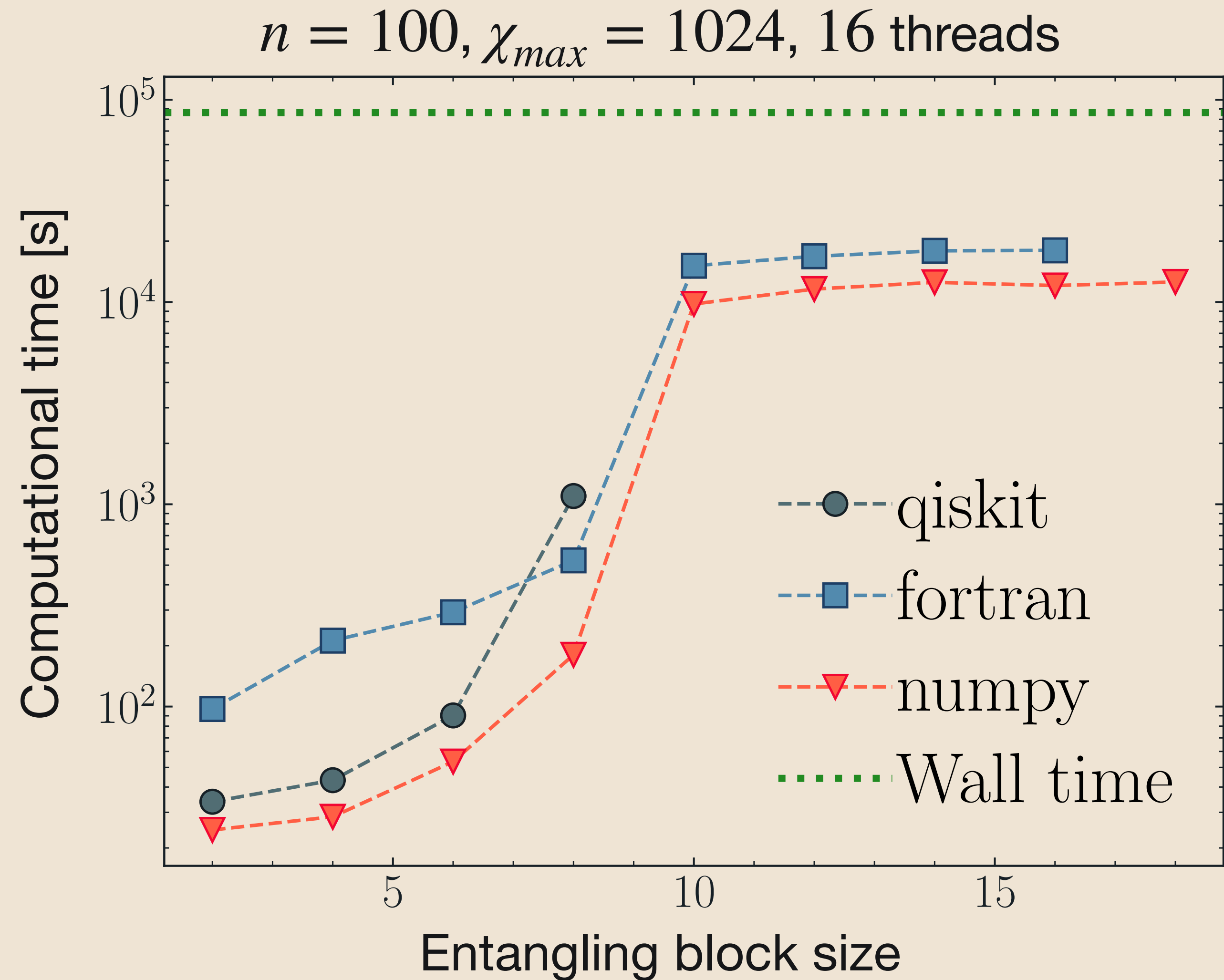
- Use of the unbiased sampling
- Quantum matcha tea simulations used as target state to compute the fidelity of a simulation with crosstalk



# Conclusions

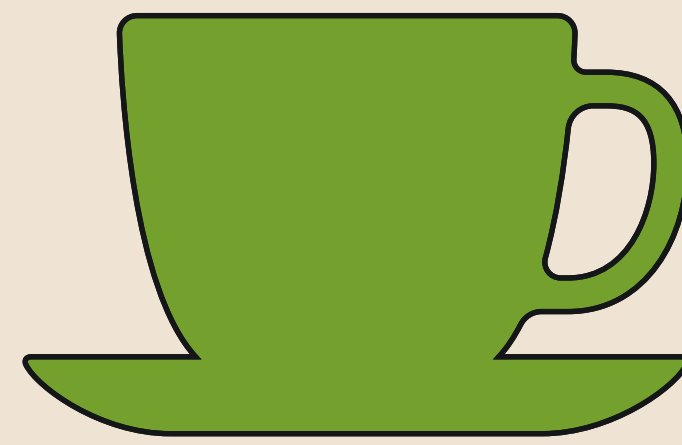


MPS simulations are not limited by the number of qubits but by the entanglement



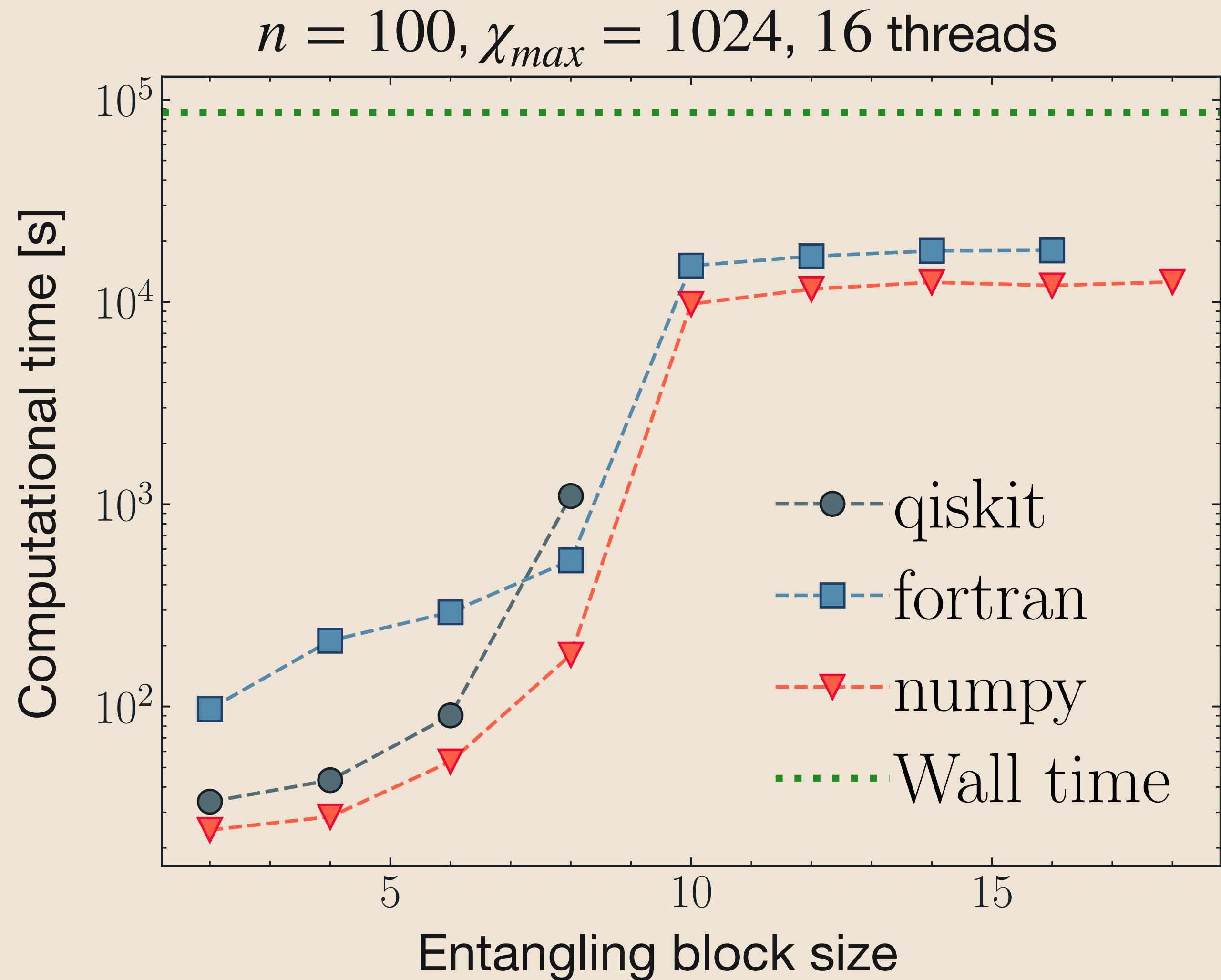


# Conclusions

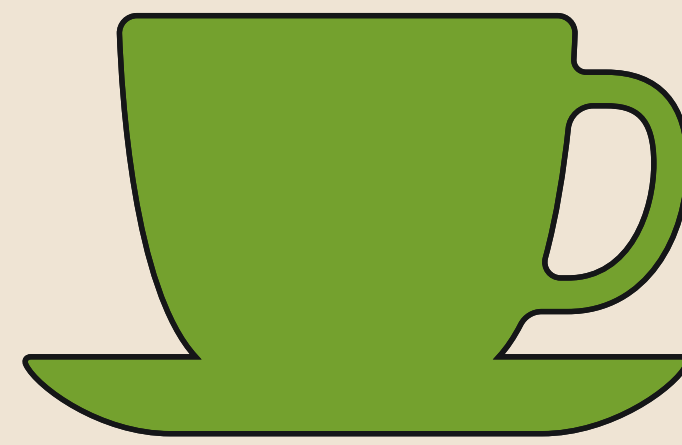


MPS simulations are not limited by the number of qubits but by the entanglement

Easy-to-use python frontend and fast HPC-ready backend (Both GPU and CPU)



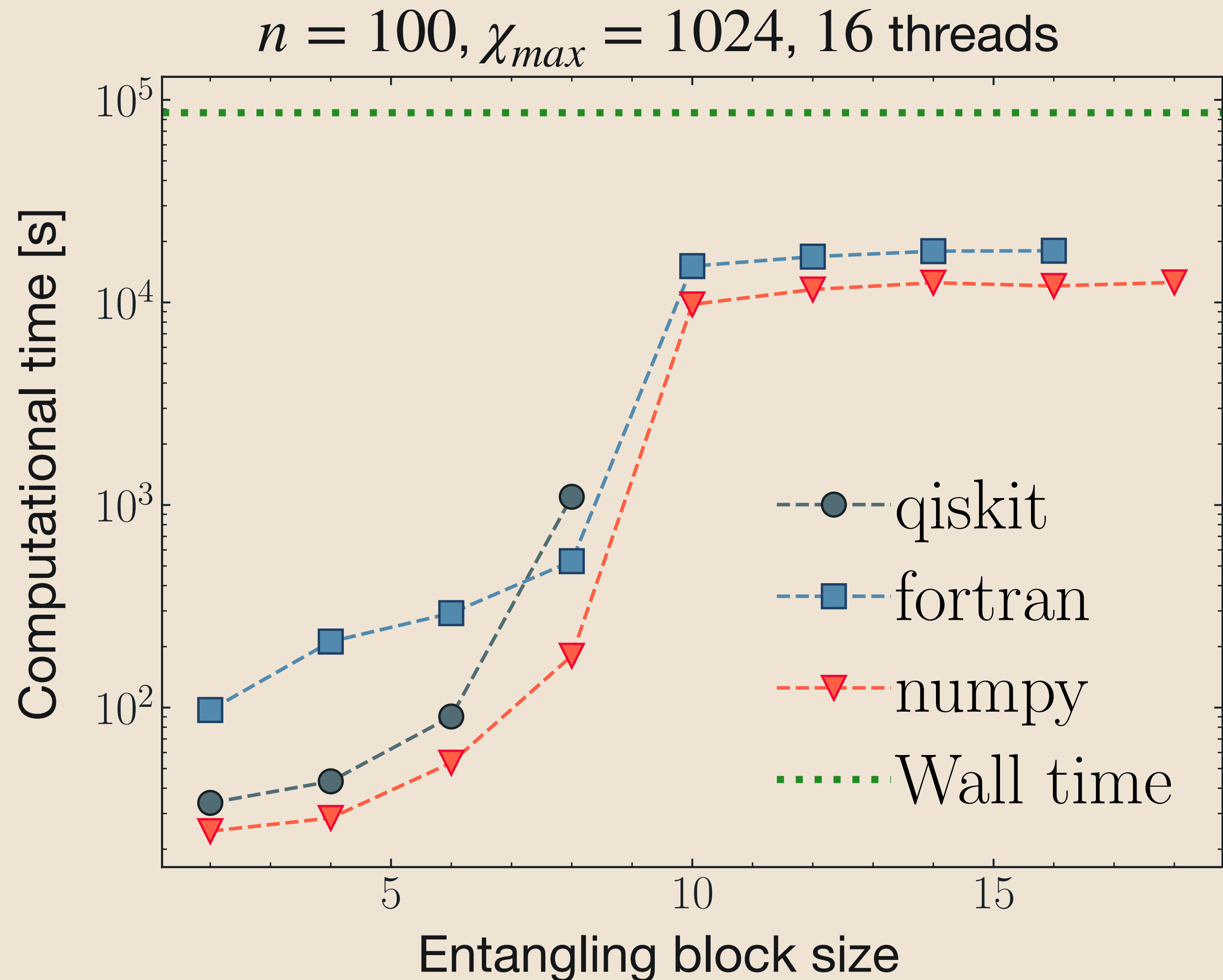
# Conclusions



MPS simulations are not limited by the number of qubits but by the entanglement

Easy-to-use python frontend and fast HPC-ready backend (Both GPU and CPU)

Error analysis tools and efficient computations of observables optimised for the MPS representation



# Thanks for your attention



Dipartimento  
di Fisica  
e Astronomia  
Galileo Galilei



universität  
**uulm**

**CINECA**



Simone Montangero



Daniel Jaschke

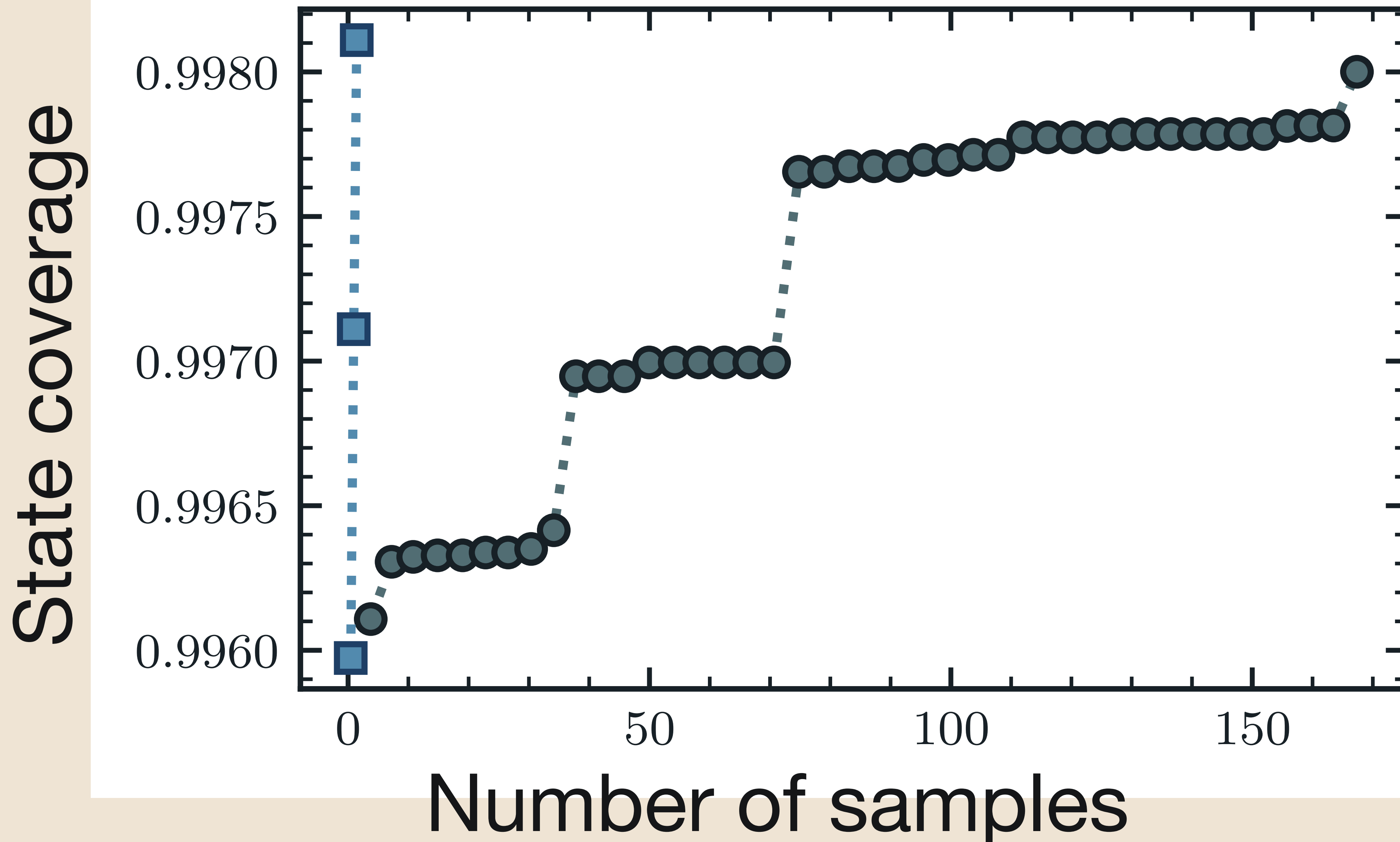
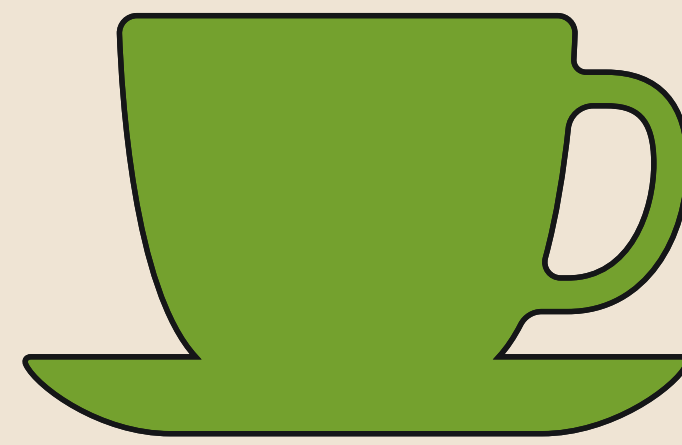


Riccardo Mengoni



Daniele Ottaviani

# Efficient sampling of final state

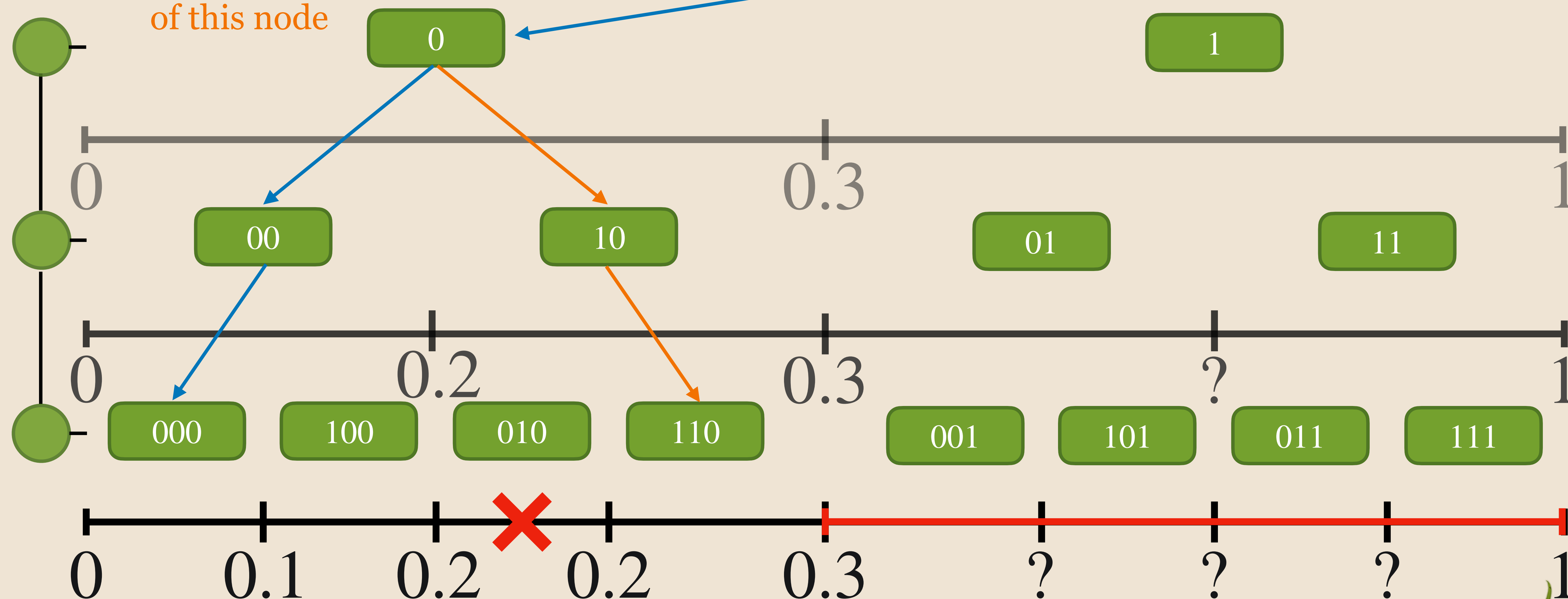


# Efficient sampling of final state



Reuse the computation of this node

Sample random number  $n = 0.05, 0.29$



We know which states we did not sample and can sample only here in second round

